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## ORIGINAL ARTICLE Microbial expression profiles in the rhizosphere of willows depend on soil contamination

Etienne Yergeau<sup>1</sup>, Sylvie Sanschagrin<sup>1</sup>, Christine Maynard<sup>1</sup>, Marc St-Arnaud<sup>2</sup> and Charles W Greer<sup>1</sup>

<sup>1</sup>National Research Council Canada, Energy, Mining and Environment, Montreal, Quebec, Canada and <sup>2</sup>Biodiversity Center, Institut de recherche en biologie végétale, Université de Montréal and Jardin botanique de Montréal, Montreal, Quebec, Canada

The goal of phytoremediation is to use plants to immobilize, extract or degrade organic and inorganic pollutants. In the case of organic contaminants, plants essentially act indirectly through the stimulation of rhizosphere microorganisms. A detailed understanding of the effect plants have on the activities of rhizosphere microorganisms could help optimize phytoremediation systems and enhance their use. In this study, willows were planted in contaminated and non-contaminated soils in a greenhouse, and the active microbial communities and the expression of functional genes in the rhizosphere and bulk soil were compared. Ion Torrent sequencing of 16S rRNA and Illumina sequencing of mRNA were performed. Genes related to carbon and amino-acid uptake and utilization were upregulated in the willow rhizosphere, providing indirect evidence of the compositional content of the root exudates. Related to this increased nutrient input, several microbial taxa showed a significant increase in activity in the rhizosphere. The extent of the rhizosphere stimulation varied markedly with soil contamination levels. The combined selective pressure of contaminants and rhizosphere resulted in higher expression of genes related to competition (antibiotic resistance and biofilm formation) in the contaminated rhizosphere. Genes related to hydrocarbon degradation were generally more expressed in contaminated soils, but the exact complement of genes induced was different for bulk and rhizosphere soils. Together, these results provide an unprecedented view of microbial gene expression in the plant rhizosphere during phytoremediation.

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## Introduction

The rhizosphere comprises the surface of the roots and the surrounding soil area where plant root exudates sustain a high microbial activity and high microbial density (Smalla *et al.*, 2001; Kowalchuk et al., 2002). However, bacterial diversity in the rhizosphere is generally lower than in the bulk soil (Marilley and Aragno, 1999), and microbial community composition is very different (Smalla et al., 2001; Kowalchuk et al., 2002; Griffiths et al., 2006; Kielak et al., 2008), suggesting a strongly selective environment. This selection pressure results from the exudation of specialized antimicrobials and signaling molecules (for example, flavonoids, salicylic acid and phytoalexins), carbon example, organic acids (for and aromatic compounds) and nitrogen (for example, amino

Correspondence: E Yergeau, National Research Council of Canada, Energy, Mining and Environment, 6100 Royalmount Avenue, Montreal H4P 2R2, Quebec, Canada. E-mail: etienne.yergeau@cnrc-nrc.gc.ca

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acids) compounds. The rhizosphere is thereby selectively enriched in microorganisms that are adapted to highly competitive environments and to the utilization of specific plant compounds (Berg et al., 2002; Gomes et al., 2003; Berg et al., 2005; Haichar *et al.*, 2008). These compounds are not only exuded for the benefit of microbes, but more often they profit the plant itself. For instance, organic acids such as malate, citrate and oxalate are often present in the rhizosphere, and in addition to being a carbon source for many microbes, they are involved in many plant processes such as metal detoxification, nutrient acquisition and alleviation of stress (Jones, 1998). Interactions in the rhizosphere have evolved over millions of years and can be seen as a way for plants to reach a minimal stress level by, among others, deterring pathogens, increasing their nitrogen and phosphorus uptake and detoxifying the environment. Plants confronted with stressful environments normally respond by increasing root exudation (Jones *et al.*, 2004; Qin et al., 2007; Naik et al., 2009), which leads to increased microbial biomass in the rhizosphere (Esperschutz et al., 2009).

willow growing in contaminated and non-contaminated soils as compared with bulk soil. We harvested the rhizosphere of willows planted in pots containing contaminated and non-contaminated soil, as well as soil from non-planted pots. Gene expression profiles were contrasted using metatranscriptomic analyses based on Illumina sequencing, and microbial communities were compared based on Ion Torrent sequencing of 16S rRNA. Our results indicate major shifts in the potential for carbon and amino-acid uptake, and utilization, nutrient cycling and hydrocarbon degradation in the rhizosphere of willows, with a much stronger stimulation in contaminated soils. To our knowledge, this is the first functional metatranscriptomic

## Materials and methods

plant-microbial interactions.

For more details, see the Supplementary Material and Methods.

profiling of microbial activities in the rhizosphere, providing an unprecedented level of detail on

### Greenhouse experiment

Contaminated and non-contaminated soils were collected at a former petrochemical plant site at Varennes, QC, Canada (geographic coordinates: contaminated: 45.699145 and -73.430997, and noncontaminated: 45,700788 and -73,430302). Various petrochemical activities had been carried out on this site, starting in 1953 to the shutdown of the plant in 2008. The soils have been contaminated for decades by mixed petrochemical residues (see Supplementary Table S1 for detailed soil analyses). After sampling, soils were mixed thoroughly and distributed in 201 pots. Willow cuttings (Salix purpurea cultivar Fish Creek) were first grown for 8 weeks in sterile potting media and then transferred to the pots containing Varennes soil on 4 October 2011. At the time of the transfer, the longest stem that grew from the cuttings was  $\sim 20 \text{ cm}$  long and the potting media was densely colonized by roots. Half of the pots remained unplanted and each treatment was replicated six times. The experimental design was a split-plot with soil contamination randomized first and planted or unplanted randomized in the subplots. The plants were grown in a greenhouse at the Institut de recherche en biologie végétale, Montreal, under natural daylight supplemented with highpressure sodium-vapor lamps, and temperatures of 20 °C in day and 18 °C at night. The moisture in every pot was maintained near-field capacity by frequent watering, and saucers were used under pots to prevent leaching of contaminants.

## Soil sampling

For molecular analyses, pots were sampled at the end of the experiment (26 April 2012,  $\sim 6$  months after planting). For rhizosphere soil, plants were

environment or render them harmless by using plants to stabilize, filter, volatilize, extract or degrade organic and inorganic pollutants (Salt et al., 1998; Pilon-Smits, 2005). For the degradation of organic contaminants, plants essentially act indirectly through the specific stimulation of rhizosphere and endophytic microorganisms (Barac et al., 2004; Kuiper et al., 2004; Taghavi et al., 2005). Phytoremediation takes advantage of the long-evolved intimate relationships between plant and microbes, of the stimulating effect of plants on microbes and of the natural hardiness and competitiveness of rhizosphere microbes to remediate contaminated soils or to mobilize inorganic contaminants and favor their accumulation in plant tissues. It is one of the least expensive and most environmentally friendly remediation techniques, being on average tenfold less expensive than traditional excavation techniques ('dig and dump') (Glass, 1999) and causing very little disruption to the environment. However, phytoremediation often proceeds slowly, as the stimulation of degrading microbes is mainly restricted to the immediate zone of influence of the roots (Pilon-Smits, 2005). For these reasons, other approaches are often preferred and phytoremediation is restricted to niche markets where time is not an issue and the contamination is moderate and superficial. To avoid this limitation, fast-growing trees that rapidly develop deep-root systems and produce large biomass, such as poplars and willows, were suggested (Schnoor et al., 1995). Willow trees have several key advantages for phytoremediation when compared with other plants: they are genetically very diverse (400 species and over 200 hybrids, Newsholme, 2003), some species can be harvested frequently by coppicing, they are pioneer plants that have invasive growth strategies and very effective nutrient uptake systems, they grow fast and have high evapotranspiration rates and high productivity (Pulford and Watson, 2003). Although several studies have assessed the microbial communities associated with willows growing in contaminated soils (Leigh et al., 2006; de Carcer et al., 2007a,b; Kuffner et al., 2008; Hrynkiewicz et al., 2009; Zimmer et al., 2009; Weyens et al., 2013; Bell et al., 2014), the details of willow interactions with microbes are still not well understood. Clearly, plant-microbe interactions are at the

One biotechnological application of the 'rhizo-

sphere effect' is phytoremediation. The goal of

phytoremediation is to remove pollutants from the

Clearly, plant-microbe interactions are at the center of the phytoremediation process of organic contaminants and have a role in the mobilization of inorganic contaminants, but which rhizosphere genes and organisms are involved and how these complex interactions are affected by contaminant type and concentration have not been elucidated. This knowledge is crucial to fully optimize the degradation processes that occur in the rhizosphere. In this study, our main objective was to understand what microorganisms are activated and what microbial genes are upregulated in the rhizosphere of completely recovered from the pots and shaken vigorously to remove excess soil. Soil still adhering to the roots at this stage was considered as rhizosphere soil. Soil from unplanted pots was taken at a depth of  $\sim 5 \,\mathrm{cm}$ . At least five different soil subsamples were collected from each pot and homogenized in 50 ml Falcon tubes and immediately flash frozen in liquid nitrogen. In total, the entire process for one pot never took more than a few minutes. Tubes were transported from the greenhouse to the lab under dry ice and kept frozen at -80 °C until the nucleic acid was extracted. For chemical analyses, pots were sampled at the beginning and at the end of the experiment. From each pot, soil was collected from at least five different zones and homogenized in an amber glass container. Soil samples were sent to Maxxam Analytics (Montreal, QC, Canada), where soil was analyzed for C10-C50 hydrocarbons (sum of all aliphatic hydrocarbon compounds with chain lengths from C10–C50) and polycyclic aromatic hydrocarbons (PAHs) according to standard protocols. The percentage degradation was calculated separately for each of the pots.

### Nucleic acid extraction

Approximately 2g of frozen soil was weighed and extracted using MoBio RNA PowerSoil total RNA isolation kit with the RNA PowerSoil DNA elution accessory kit (MoBio, Carlsbad, CA, USA). RNA extracts were treated with Ambion TURBO DNAse (Life Technologies, Burlington, ON, Canada) and the absence of DNA was confirmed by 16S rRNA gene universal PCR.

#### Ion Torrent 16S rRNA sequencing

Reverse-transcriptase (RT)-PCR of the partial 16S rRNA was performed using the universal primers F343 and R533 containing the 10-bp multiplex identifiers and adaptor sequences for Ion Torrent sequencing described previously (Yergeau *et al.*, 2012; Bell et al., 2013). The sequencing of the pooled library was done using the Ion Torrent Personal Genome Machine system (Life Technologies). Sequences were binned and filtered using a custom-made Perl script. Taxonomic identities were assigned to sequences using the 'multiclassifier' Weighted-normalized (http://pyro.cme.msu.edu/). Unifrac distances between each sample pair were calculated using the FastUnifrac website (Hamady et al., 2010) based on the GreenGene core data set.

### Illumina mRNA sequencing

rRNA was subtracted following the protocol described by Stewart *et al.* (2010). Total rRNA-subtracted RNA was reverse-transcribed using the SuperScript III kit (Invitrogen). Illumina libraries were prepared following the protocol of Meyer and

Kircher (2010), with indices 1–24 pooled together and sent for eight lanes of Illumina HiSeq 2000 paired-end  $2 \times 101$  bp sequencing at McGill University and Génome Québec Innovation Center, Montréal. Data from the different lanes were pooled together and the resulting 48 files were filtered in pairs using a custom-made Perl script. The resulting high-quality sequences were submitted to MG-RAST 3.0 (Meyer *et al.*, 2008) for automated annotation.

#### Data analysis

All statistical analyses were carried out in R (v 2.13.2, The R Foundation for Statistical Computing). Normal distribution and variance homogeneity of the data were tested using the 'shapiro.test' and 'bartlett.test' functions, respectively. If the data were not normally distributed or did not show homogeneous variance, they were log transformed before analysis of variance (ANOVA) analyses. ANOVA were carried out using the 'aov' function, whereas *t*-test were performed using the 't.test' function. Multivariate tests of hypothesis were carried out using Permanova with the 'adonis' function of the 'vegan' package. The Unifrac matrix was used for principal coordinate analyses (PCoA) that were carried out using the 'pcoa' function of the 'ape' package.

## **Results**

# Soil physico-chemical characteristics and plant biomass

The non-contaminated soils contained no PAH and no C10-C50 hydrocarbons at the beginning of the experiment (Table 1; see Supplementary Table S1 for a description of the contaminants). There was only one exception in the to-be planted pots, where C10-C50 hydrocarbons were detected at a level of  $110 \text{ mg kg}^{-1}$  (Supplementary Table S1). At the end of the experiment, all the soils in the non-contaminated pots had C10–C50 and PAH concentrations below the detection limit. For the contaminated soils. no significant differences at P < 0.05(t-test) were observed between the planted and unplanted pots at the beginning of the experiment or at the end for both C10-C50 and PAHs (Table 1, Supplementary Table S1). The concentrations of C10-C50 and PAHs were more variable at the beginning of the experiment (C10-C50:  $480-4200 \text{ mg kg}^{-1}$ ; PAH: 15.6–186.4 mg kg<sup>-1</sup>) than at the end of the experiment (C10–C50: 270–  $660 \text{ mg kg}^{-1}$ ; PAH:  $3.0-19.3 \text{ mg kg}^{-1}$ ). There was a large decrease in hydrocarbon concentrations in all contaminated soils during the incubation period, but there was no significant difference between planted and unplanted pots at P < 0.05 (*t*-test), with degradation ranging from 0% to 91% for C10–C50 and from 65% to 93% for PAH.

At the final time of sampling (April 2012), contaminated and non-contaminated soils from the

	C10–C50			РАН		
	$\begin{array}{c} October \ 2011 \\ (mgkg^{-1}) \end{array}$	April 2012 (mg kg <sup>-1</sup> )	% Degraded	October 2011 $(mg kg^{-1})$	April 2012 (mg kg <sup>-1</sup> )	% Degraded
NC-NP NC-P C-NP C-P	$\begin{array}{c} 0.00 \pm 0.00 \\ 18.33 \pm 44.91 \\ 1,546 \pm 635 \\ 912 \pm 402 \end{array}$	$\begin{array}{c} 0.00 \pm 0.00 \\ 0.00 \pm 0.00 \\ 438 \pm 104 \\ 447 \pm 167 \end{array}$	$NA \\ NA \\ 62.0 \pm 35.5 \\ 45.6 \pm 23.2$	$\begin{array}{c} 0.00 \pm 0.00 \\ 0.00 \pm 0.00 \\ 59.6 \pm 31.6 \\ 60.3 \pm 37.8 \end{array}$	$\begin{array}{c} 0.00 \pm 0.00 \\ 0.00 \pm 0.00 \\ 8.3 \pm 4.1 \\ 8.7 \pm 5.9 \end{array}$	$\begin{array}{c} {\rm NA} \\ {\rm NA} \\ 85.1 \pm 4.7 \\ 82.9 \pm 10.7 \end{array}$

 Table 1
 Soil C10–C50 and PAH concentrations at the beginning (October 2011) and at the end (April 2012) of the greenhouse experiment

Abbreviations: C-NP, contaminated, not planted; C-P, contaminated, planted; NA, not applicable; NC-NP, not contaminated, not planted; NC-P, not contaminated, planted; PAH, polycyclic aromatic hydrocarbons.

The % degradation was calculated separately for each of the pots.

Values are average  $\pm$  s.d. (N=6 for all except C-NP, where N=5 after removal of one outlier (pot 62; Supplementary Table S1)).

unplanted pots and from the rhizosphere of willows were sampled for chemical analyses. Waterextractable PO<sub>4</sub> was not detected in any of the samples, whereas the concentration of water-extractable K was significantly higher in contaminated soil independent of the soil compartment  $(379 \,\mu M \, kg^{-1})$ vs  $261 \,\mu M \, kg^{-1}$ ), and the concentration of waterextractable NO3 was significantly lower in the rhizosphere of willows independent of contamination levels  $(59.5 \,\mu\text{M kg}^{-1})$  vs  $454.9 \,\mu\text{M kg}^{-1}$ (B Cloutier-Hurteau, M-C Turmel and F Courchesne, personal communication). For willow biomass, there was no significant difference between willows growing in contaminated or non-contaminated soils for the shoots (average: 36.0 g), the roots (average: 6.9g) and total plant biomass (average: 50.3g), but the willows growing in contaminated soils had significantly higher leaf biomass (8.4 g vs 6.3 g) (B Cloutier-Hurteau, M-C Turmel and F Courchesne, personal communication).

#### Carbon and amino-acid utilization

The expression of several gene categories (MG-RAST 'level 3') related to carbon uptake and utilization was significantly influenced by the presence of plants and soil contamination levels (Figure 1a). Most gene categories were more actively expressed in the rhizosphere of contaminated soils, including all gene categories related to organic acids (Figure 1a). The non-planted soils clustered together and shared similar expression levels of several gene categories, but the rhizosphere soils showed very dissimilar patterns of expression and did not cluster together (Figure 1a). Permanova tests for the effect of the different treatments on all the gene categories selected yielded significant results for contamination level (F = 4.75, P = 0.0010) and willow presence (F = 7.43, P = 0.0001), but not for the interaction between contamination and willow. Based on the F-ratios, the strongest effect was seen when comparing non-planted vs rhizosphere soils. The expression of the phosphoenolpyruvate carboxykinase (pckA) gene, which encodes the enzyme that catalyses the key rate-limiting step in gluconeogenesis, was significantly induced by willow presence (F = 7.40, P = 0.015), but not by contamination level (Figure 2a). Similarly, the expression of carbohydrate uptake ABC transporter (CUT1 family), which is usually involved in the import of oligosaccharides and their derivatives, was significantly enhanced in the rhizosphere of willows (F = 7.19, P = 0.015), but not affected by contamination levels (Figure 2a).

Most gene categories (MG-RAST 'level 3') related to amino-acid utilization and degradation were more expressed in the rhizosphere of willows planted in contaminated soils (Figure 1b). This was also true for the degradation of aromatic amino acids such as tryptophan and histidine (Figure 1b). In the case of histidine degradation, this gene category was also highly expressed in the rhizosphere of willows planted in non-contaminated soils (Figure 1b). The non-contaminated soils clustered together, whereas the contaminated willow rhizosphere soil was a clear outlier (Figure 1b). Permanova tests for the effect of treatments on the overall expression pattern of amino-acid utilization gene categories resulted in a significant interaction term (F = 5.28, P = 0.002), suggesting a differential effect of willows in contaminated and non-contaminated soils. Contamination level and willow presence also had a significant influence on gene expression patterns (F = 4.69, P = 0.0034 and F = 6.63, P = 0.00030,respectively). Based on the F-ratios, the strongest effect was seen when comparing non-planted vs rhizosphere soils.

#### Competition and cooperation

There was a significant effect of contamination level (F = 16.15, P=0.00067) and willow presence (F = 29.33, P=0.000027), but not of the interaction term on the expression of genes related to antibiotic resistance. Antibiotic resistance genes were more expressed in the rhizosphere of willow across both contamination levels (Figure 2b). Similarly, antibiotic resistance genes were significantly more expressed in contaminated soils, regardless of willow presence. These two trends resulted in a



Figure 1 Carbohydrate (a) and amino-acid (b) uptake and utilization potential patterns for contaminated (C) or non-contaminated (NC) rhizosphere (P) or bulk (NP) soil. The heatmaps are drawn from centered-scaled normalized mRNA abundance data averaged for each treatment (N=6); the darker the cell, the higher the mRNA abundance. The MG-RAST 'hierarchical classification' functionality was used with the M5NR database and, from the level 1 'carbohydrates' and 'amino acids and derivative' gene categories, all level 3 gene categories that contained the keywords 'utilization', 'degradation', 'catabolism', 'uptake' were selected.

higher expression of antibiotic resistance genes in the rhizosphere of willows planted in contaminated soils as compared with all other treatments (Figure 2b). The expression of quorum sensing and biofilm formation genes was significantly affected by contamination level (F = 26.14, P = 0.000053), willow presence (F = 23.47, P = 0.000098) and the interaction term (F = 8.40, P = 0.0089).

#### Active microbial community composition

Two methods were used to determine active microbial community composition: taxonomic classification of all sequenced mRNA in MG-RAST and 16S rRNA sequencing. The first method, with the normalization used in this study, gives the activity (total abundance of mRNA) for different taxa, whereas the second method gives an overview of



**Figure 2** Normalized mRNA abundance for (**a**) phosphoenolpyruvate carboxykinase (*pckA*) and carbohydrate uptake ABC transporter (CUT1) and (**b**) quorum sensing and biofilm formation gene category and antibiotic resistance genes for contaminated (C) or noncontaminated (NC) rhizosphere (P) or bulk (NP) soil. For (**a**), the MG-RAST 'all annotation' functionality with the GenBank database was used to search for the genes of interest. For (**b**), the MG-RAST 'hierarchical classification' functionality was used with the M5NR database and the 'Quorum sensing and biofilm formation' level 2 gene category or the antibiotic resistance-related gene categories from the 'Resistance to antibiotics and toxic compounds' level 2 gene category were summed. Values are normalized abundances, and error bars are s.d. (N=6). \*\*P<0.001; \*\*\*P<0.001; n.s: not significant.

the active community composition with relative activity values (percentage of all ribosomes) for different taxa. There was a significant effect of contamination level (F = 27.22, P = 0.000042) and the interaction term (F = 17.14, P = 0.00051) on the total abundance of mRNA related to Bacteria (bacterial activity), whereas the effect of willow was marginally significant (F = 3.36, P = 0.082) (Figure 3a). This was confirmed by RT-quantitative PCR based on bacterial 16S rRNA, which identified the contaminated willow rhizosphere soil as having significantly higher bacterial activity. In contrast, fungi were significantly more active in the rhizosphere of willows (F = 43.22, P = 0.0000021) as compared with bulk soil, and the interaction term was significant (F = 7.36, P = 0.013), whereas conlevel had no tamination significant effect (Figure 3a). This different rhizosphere effect on bacterial and fungal activity was also visible at the phylum/class level, where most fungal phyla (Basidiomycota, Ascomycota and Glomeromycota) were more active in the rhizosphere of willows planted in non-contaminated soils (Figure 3b). Actinobacteria and Firmicutes were also more active in the rhizosphere of willows planted in non-contaminated soils. In contrast, several of the most abundant bacterial phyla/classes (Alphaproteobacteria, Betaproteobacteria, Gammaproteobacteria and Acidobacteria) were more active in the rhizosphere of willows planted in contaminated soils (Figure 3b). Most phyla/classes showed low activity in the bulk soil, and contaminated and non-contaminated bulk soils clustered together (Figure 3b). *Euryarchaeota* were more active in the contaminated bulk soil, whereas *Crenarchaeota* and *Thaumarchaeota* were more active in the rhizosphere of willows planted in non-contaminated soil (Figure 3b). When testing the effects of the treatments on the activities at the phylum/class level using Permanova, the interaction term was significant (F=9.20, P=0.0001) as well as both single factors (contamination level: F=4.61, P=0.0044, willow presence: F=13.39, P=0.0001), with a dominance of the willow effect (higher F-ratio).

The significant differences observed at the phylum/class level persisted at lower taxonomic levels. At the genus level, the interaction term (F = 9.60,P = 0.0001) and both single factors (contamination: F = 4.74, P = 0.0021; willow presence: F = 6.96, P = 0.0003) were significant in Permanova tests. The effect of willow presence was then tested on each genus, separately for contaminated and noncontaminated soils (Supplementary Table S2). The activities of several genera were significantly affected by willows both in contaminated and noncontaminated samples. However, more genera were significantly affected by willows in the non-contaminated soils (78 less active with willows and 1963 more active with willows, total 2041) than in the contaminated soils (8 less active with willows and 110 more active with willows, total 118). Among these, 42 genera were significantly affected

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Figure 3 Microbial activities per taxa, based on total mRNA. (a) Normalized abundance of bacterial and fungal-related mRNA. Values are normalized abundances, and error bars are s.d. (N=6). \*P<0.05; \*\*\*P<0.001; n.s.: not significant. (b) Heatmap for different phyla/ classes drawn from centered-scaled normalized mRNA abundance data averaged for each treatment (N=6); the darker the cell, the higher the mRNA abundance.

by willows at both contamination levels, and the 24 bacterial and fungal genera among those are listed in Supplementary Table S2. Among the genera consistently activated by willows at both contamination levels, some were previously reported as having interesting characteristics for phytoremediation, for instance, *Methylibium petroleiphilum* is involved in aromatic hydrocarbon and methyl tertbutyl ether degradation (Nakatsu *et al.*, 2006), *Mesorhizobium* is a well-known genus involved in nitrogen fixation, some species are resistant to metals (Vidal *et al.*, 2009; Huang *et al.*, 2010) and can degrade acetonitrile (Feng and Lee, 2009), some *Variovorax* species display plant growth promoting activities and are able to degrade various

contaminants (Han et al., 2011) and Parvibaculum species are able to degrade linear carbon chains, including alkanes (Schleheck *et al.*, 2004;Rosario-Passapera et al., 2012). Some other genera showed contrasting responses to willows when exposed to different concentrations of contaminants (Supplementary Table S2). Most of the genera that were positively affected by willows in contaminated soils and negatively affected in non-contaminated soils belonged to the Alphaproteobacteria or the Gammaproteobacteria, whereas the two genera negatively affected by willows in contaminated soils, but positively affected in non-contaminated soil belonged to the Blastocladiomycota (Supplementary Table S2).



**Figure 4** Active microbial community composition based on 16S rRNA gene sequencing for contaminated (C) or non-contaminated (NC) rhizosphere (P) or bulk (NP) soil. (a) Community composition at the phylum/class level averaged for each treatment (N=6). (b) PCoA based on Unifrac distances between samples for non-contaminated (NC) and contaminated (C) soils.

The active community composition based on 16S rRNA gene sequencing revealed that contamination level was the main influencing factor (Figure 4a). However, within this dominant effect of contamination levels, willow presence did have some effect on bacterial community composition. At lower taxonomic levels (Unifrac distances), willow presence only had a significant effect on microbial communities in the contaminated soils (Permanova: non-contaminated soils: F = 1.29, P = 0.14; and contaminated soils: F = 1.95, P = 0.016). This effect can also be visualized in the principal coordinate ordinations (Figure 4b). In contrast, active species richness (number of operational taxonomical units at 97% similarity) was not affected by willow presence or contamination levels.

#### Nitrogen cycle genes

Nitrogen cycling is one of the key soil functions in the context of soil bioremediation, where nutrients are often limiting due to an unbalanced C:N ratio. Willow significantly increased the expression of ammonia monooxygenase genes, as willow presence was the only significant factor in ANOVA tests (F = 5.68, P = 0.027) (Figure 5a). Willows presence appeared to have a stronger effect on ammonia monooxygenase expression in non-contaminated soils (Figure 5a). Willow had a significant influence on the expression of several other genes, with an increased expression of genes related to nitrogen fixation (nitrogenase) and nitrate reduction in the rhizosphere, and higher expression of several genes related to denitrification in the bulk soils (Figure 5b). The overall effect of the treatments on the different nitrogen cycle genes was tested by Permanova, which highlighted significant effects of willow presence (F = 2.39, P=0.034), contamination levels (F = 2.75, P=0.016) and the interaction term (F = 2.46, P=0.027).

#### Hydrocarbon degradation genes

The expression of alkane hydroxylase genes was significantly affected by contamination level (F = 23.50, P = 0.000098), willow presence (F = 10.52, P = 0.0041) and the interaction term (F = 5.73, P = 0.027), with a dominating effect of contamination (higher F-ratio) (Figure 6a). Alkane hydroxylases genes were more expressed in the rhizosphere of willows planted in contaminated soils than in any other treatment (Figure 6a). For the expression of genes related to the degradation of aromatic compounds, Permanova tests revealed a strong effect of contamination (F = 7.76, P = 0.0001) and of willow presence (F = 3.90, P = 0.0056), whereas the interaction term was significant but with a weaker effect (F = 2.63, P = 0.030). Within contaminated soils,

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Figure 5 Activities related to the nitrogen cycle for contaminated (C) or non-contaminated (NC) rhizosphere (P) or bulk (NP) soil. (a) Normalized abundance for ammonia monooxygenase (*amoA*)-related mRNA. The MG-RAST 'all annotation' functionality with the GenBank database was used to search for the genes of interest. Values are normalized abundances and error bars are s.d. (N=6). \*P<0.05; n.s.: not significant. (b) Heatmap for different gene categories related to the N-cycle drawn from centered-scaled normalized mRNA abundance data averaged for each treatment; the darker the cell, the higher the mRNA abundance. The MG-RAST 'hierarchical classification' functionality was used with the M5NR database and from the level 1 'Nitrogen metabolism' gene category functions that had key roles in the N-cycle, were selected.

willows induced the expression of several aromatic degradation gene categories and pathways, whereas some others were repressed by the presence of willows and others were highly expressed across contaminated soils (Figure 6b). With a few exceptions, the vast majority of aromatic hydrocarbon degradation gene categories showed relatively low expression levels in the non-contaminated soils (Figure 6b).

## Discussion

Several studies have addressed the transcriptomics of the rhizosphere (Diehn and Relman, 2001; Mark *et al.*, 2005; Matilla *et al.*, 2007; Ramachandran *et al.*, 2011), but always using a controlled approach with a single bacterium, one or a few plants in sterile substrates or purified root exudates. In this study, we used a metatranscriptomic approach and assessed the whole microbial community associated with willow roots growing in non-sterile soil from a contaminated site. This extremely powerful approach has often been proposed (Kowalchuk *et al.*, 2010; Schenk *et al.*, 2012; Turner and Poole, 2013) and was recently applied to examine taxonomic changes in the rhizosphere (Turner *et al.*, 2013) but, to our knowledge, this is the first time it has been used to assess the functions, activities and the interactions in the rhizosphere at the community level. The results presented here give, with an unprecedented level of detail, a portrait of the microbial activities in the rhizosphere of willows as compared with bulk soil, and link these shifts to the potential for phytoremediation of organic contaminants by willows.

#### Metatranscriptomics of the rhizosphere

Although the composition of the active microbial community (based on 16S rRNA genes; Figure 4) did not vary much with the introduction of willows, being more strongly affected by the contamination levels, the community members drastically changed their activities (based on mRNA; Figure 3). Microbes in the rhizosphere of willow had significantly different expression patterns for genes involved in



**Figure 6** Activities related to hydrocarbon degradation for contaminated (C) or non-contaminated (NC) rhizosphere (P) or bulk (NP) soil. (a) Normalized abundance for alkane hydroxylase-related mRNA. The MG-RAST 'all annotation' functionality with the GenBank database was used to search for the genes of interest. Values are normalized abundances, and error bars are s.d. (N=6). \*P<0.05; \*P<0.01; \*\*\*P<0.001. (b) Heatmap for different gene categories related to the metabolism of aromatic compounds drawn from centered-scaled normalized mRNA abundance data averaged for each treatment (N=6); the darker the cell, the higher the mRNA abundance. The MG-RAST 'hierarchical classification' functionality was used with the M5NR database and from the level 1 'Metabolism of aromatic compounds' all level 3 gene were used.

carbon and amino-acid uptake and utilization, strong, indirect evidence for the use of compounds in root exudates. The overall increase in the expression of phosphoenolpyruvate carboxykinase (involved in the rate-controlling step of glucose synthesis; repressed by sugars) and CUT1 transport gene (involved in the transport of oligosaccharides) expression in the rhizosphere and the high expression of organic acid uptake and utilization genes in the contaminated rhizosphere suggest that simple sugars are not the main bacterial carbon source in the rhizosphere of willows. Organic acids were previously reported as the main source of carbon in the rhizosphere of many plants, including poplar (Jones, 1998; Lugtenberg et al., 2001; Naik et al., 2009; Ramachandran *et al.*, 2011).

The effect of willow presence varied depending on the contamination level of the soil. For instance, bacteria appeared to be generally stimulated in contaminated soils along with many functions, whereas fungi were more clearly stimulated in non-contaminated soils. Similarly, the rhizosphere effect of birch on soil microbial communities was reported to depend on PAH concentration (Sipilä et al., 2008). One possible explanation for this result is that plants recruit the rhizosphere microbial communities from the adjacent bulk soil (de Ridder-Duine et al., 2005; Dennis et al., 2010; Lundberg et al., 2012), and that contaminated and non-contaminated soils harbored different starting microbial communities (Figure 4). Along with specialized carbon compounds, plants also exude

several antimicrobial compounds that create a strongly selective environment in the rhizosphere (Bais et al., 2006). Several studies reported decreased microbial diversity in the rhizosphere (Marilley and Aragno, 1999; Kowalchuk et al., 2002), supporting the concept of a more selective environment. In our case, the presence of contaminants in the soils is imposing a further selection pressure on microorganisms. Under this doubleselection pressure, only microorganisms that can use specialized carbon sources, can cope with the presence of contaminants and are highly competitive will be significantly activated by willows. Our results showed that more microbial genera were activated by willows in non-contaminated soils than in contaminated soils. We also observed significant increases in the expression of antibiotic and toxic compound resistance genes in the rhizosphere, with stronger increases in contaminated soils, alluding to increased microbial competition or a less hospitable rhizosphere environment. Plants exude antimicrobial compounds (for example, phytoalexins, salicylic acid and flavonoids) that can lead to increased expression of antibiotic resistance genes. Salicylic acid was reported to induce the expression of antibiotic resistance genes in Escherichia coli (Cohen et al., 1993), whereas multidrug efflux pump genes of *Rhizobium etli* were induced by bean root flavonoids and were needed for resistance to phytoalexins, flavonoids and salicylic acid, and effective colonization of the rhizosphere (Gonzalez-Pasayo and Martinez-Romero, 2000). Mutation in multidrug efflux pumps reduced the fitness of Pseudomonas putida in the rhizosphere of corn (Matilla *et al.*, 2007). Increased selection pressure in the contaminated rhizosphere soil also potentially led to an increased expression of genes related to cooperation and communication (quorum sensing and biofilm formation category). Biofilm formation is an essential feature of rhizosphere colonization (Lugtenberg et al., 2001; Ramey et al., 2004) and bacteria living in biofilms have increased resistance to environmental stresses (Costerton et al., 1999; Hogan and Kolter, 2002). Consequently, genes related to biofilm formation were reported to be over-expressed during rhizosphere colonization, and their inactivation led to reduced fitness (Matilla et al., 2007; Ramachandran et al., 2011; Fan et al., 2012). Some of the genes included in the quorum sensing and biofilm formation category (for example, N-acyl homoserine lactone synthetase) are also involved in plant-microbe communication, as N-acyl homoserine lactone will induce plants to release root exudates (Mathesius et al., 2003).

In the present study, we observed an extremely pronounced induction of carbon uptake and utilization genes in the rhizosphere of willows growing in contaminated soils, indirectly suggesting an increased exudation, which could explain the different rhizosphere effects in contaminated and non-contaminated soils. Poplars root exudation of C was stimulated up to 100-fold by increasing Al, Cu and Zn concentrations (Qin et al., 2007; Naik et al., 2009). These increases in the exudation are mechanisms by which plants reduce the toxicity of trace elements in soil, as organic acids can effectively bind many compounds. Stressed beech trees were also shown to have a larger microbial biomass in their rhizosphere (Esperschutz et al., 2009). Our contaminated soils did contain a range of trace elements, but at relatively low concentrations, in the same range as the non-contaminated soils (B Cloutier-Hurteau, M-C Turmel and F Courchesne, personal communication), which is unlikely to have caused significantly higher stress to the plants in the contaminated soils. We also did not observe any clear indication of an increasingly stressful environment for the plants growing in contaminated soils. In fact, plant biomass was not reduced in contaminated soils and leaf biomass even increased when willows were planted in contaminated soils. As suggested by Henry et al. (2007), one way to improve phytoremediation would be by increasing plant stress levels through various manipulations (for example, soil nutrient and water content), in order to increase stimulation of the microbes in the rhizosphere.

The concentration of nitrate was lower in the rhizosphere of willows planted in both contaminated and non-contaminated soil. The chemical data matched well with the observed patterns in the expression of genes related to the nitrogen cycle: high nitrate concentration is conducive to the expression of denitrification genes (Barnard et al., 2005) (several of these genes were more expressed in the bulk soil) and inhibits nitrogen fixation (Streeter and Wong, 1988) (these genes were highly expressed in the rhizosphere). The lower concentration of nitrate might be because of the increased microbial activity observed in the rhizosphere, especially in contaminated soils, where bacteria were significantly more active and nitrate at its lowest concentration, being below the detection limit for two of the three replicates analyzed. Nitrate reduction was shown to be stimulated by root exudates (Henry et al., 2008), and, in this study, several nitrate reductase genes were more expressed in the rhizosphere of willow, offering another potential explanation for the lower nitrate concentration observed in the rhizosphere. Taken together, these data suggest that the stimulation of the rhizosphere hydrocarbon-degrading microorganisms by willows is not because of an increased nitrate input from the roots. However, measurements of other available nitrogen forms would be necessary to convincingly rule out if increased nitrogen input has a role in willow phytoremediation. Indeed, nitrogen transfer from willow to the rhizosphere microorganisms might take the form of amino acids, and gene expression related to their uptake and utilization were highly elevated in the rhizosphere as compared to the bulk soil.

In soils contaminated with organic pollutants, the goal of phytoremediation is to stimulate rhizobacteria to degrade the organic contaminants. Considering this, our 6-month pot experiment was successful in showing a generally higher expression of many hydrocarbon-degrading genes in the rhizosphere of willow. As expected, the expression of hydrocarbon degradation genes was mainly governed by soil contamination. However, within this overarching effect of contaminant presence, willows did have significant effects on the expression of functional genes related to hydrocarbon degradation. Willows induced the expression of several genes that were expressed at very low levels in the contaminated bulk soil. One of the most interesting features of phytoremediation is that many plant-derived chemicals (root degradation compounds, secondary metabolites, etc.) stimulate microorganisms to degrade contaminants (Donnelly et al., 1994; Fletcher and Hegde, 1995; Haby and Crowley, 1996; Miva and Firestone, 2001; Isidorov and Jdanova, 2002). Many of these plant-derived compounds are PAH analogs (Singer et al., 2003), and the rhizosphere of plants growing in uncontaminated soils is already enriched in PAH-degrading microorganisms (Daane et al., 2001). Many rhizosphere organisms also express aromatic degradation genes even in the absence of aromatic contaminants in the soil. In the absence of contaminant, it has been shown that *Pseudomonas* aromatic-degrading genes are upregulated in the corn rhizosphere, and that mutation in these genes results in a reduced fitness to rhizosphere conditions (Matilla et al., 2007). In the rhizosphere of various plants growing in non-contaminated soils, the shikimate and protocatechuate transport systems of *Rhizobium* leguminosarum were induced, and, when these genes were mutated, it led to reduced efficiency in rhizosphere colonization (Ramachandran et al., 2011). When exposing *Pseudomonas aeruginosa* to root exudates, genes related to aromatic compound catabolism and protocatechuate 3,4-dioxygenase were significantly upregulated (Mark *et al.*, 2005).

More specifically, several willow species are recognized for their production of salicylic acid and related compounds. Salicylate is derived from the amino acid phenylalanine and is degraded through the catechol or gentisate pathways (Ishiyama et al., 2004). Salicylate-degrading bacteria were previously found to be enriched beneath willows in comparison with other vegetation (Schmidt et al., 2000). Salicylate has been shown to induce transcription of genes involved in the degradation of PAH (Schell, 1985) and polychlorinated biphenyl (Master and Mohn, 2001), to enhance the microbial degradation of naphthalene (Yen and Gunsalus, 1982; Van Der Meer *et al.*, 1992) and other PAHs, such as fluoranthene, pyrene, benz[a]anthracene, chrysene and benz[a]pyrene

(Chen and Aitken, 1999), and to function as a growth substrate for polychlorinated biphenyldegrading bacteria (Singer *et al.*, 2003). Here, within a complex microbial community, many PAH-degrading genes were significantly more expressed in the rhizosphere of willows planted in contaminated soils. More tests would be necessary to discriminate the role of salicylate among other possible mechanisms explaining this increased gene expression. If salicylate is confirmed as having a major role in enhancing the survival of PAH-degrading microorganisms and increasing PAH degradation activities, improved phytoremediation could be achieved by breeding willow cultivars that have increased production of salicylate. Some researchers have investigated the efficacy of amending PAH-contaminated soil with salicylate in an effort to induce PAH degradation by indigenous soil microorganisms (Ogunseitan et al., 1991; Colbert et al., 1993).

The major weakness of phytoremediation is that the effect of plants is largely limited to the rhizosphere, and, as a consequence, phytoremediation treatments typically proceed at slower rates than other bioremediation techniques. Even with fast-growing deep-rooting trees such as willows, phytoremediation treatment during this 6-month experiment did not significantly increase global hydrocarbon degradation in the pots, as the final hydrocarbon concentrations were not significantly different between the planted and unplanted pots. The probable cause is that sufficient rhizosphere soil was not available for chemical analyses, thus soil outside the direct influence of roots (bulk soil) was included in samples for the determination of hydrocarbon concentrations. However, the fact that the contamination levels did not differ significantly at the end of our study was an added benefit, as it allowed us to discriminate between the effect of willow and contamination, without having the confounding effect of different contamination levels in planted and unplanted pots.

## Conclusions

This study provided the first in-depth metatranscriptomic view of microbial gene expression in the rhizosphere. Our results indicate a strong rhizosphere effect, with increased expression of many genes related to carbon and amino-acid utilization, nitrogen cycling and hydrocarbon degradation. This rhizosphere effect was in many cases more pronounced in contaminated soils. The large increase in the expression of hydrocarbon degradation genes in the rhizosphere of willow is promising, even though after only 6 months, we did not observe a significant effect of willows on hydrocarbon concentration outside the rhizosphere compartment. Several potential mechanisms explaining the stimulation of rhizosphere microbes were suggested: increased nitrogen inputs, increased plant exudation

due to stressful conditions and exudation of salicylate and other PAH analogs. Future studies will be focused on precisely determining the mechanism behind the observed rhizosphere stimulation of hydrocarbon degraders and devising potential ways to improve phytoremediation.

## **Conflict of Interest**

The GenoRem project contains several industrial partners, including ConocoPhillips, the company that provided us with access to their site for this study. Our manuscript has in no way been modified by ConocoPhillips, nor has any industrial partner commented on, or had any influence in, the analysis of our results. The authors declare no conflict of interest.

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