

Case studies of the spatial heterogeneity of DNA viruses in the cystic fibrosis lung

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ONLINE DATA SUPPLEMENT

Supplementary Methods and Materials

Generation of viral metagenomes

Immediately following transplant surgery at the University of California San Diego Medical Center (UCSD-MC), lung tissue sections were removed from the explanted lungs as described in (1). Lung gross pathology is demonstrated in Figure S7. The post-mortem lungs were received from UCSD-MC following autopsy as described in (1). Using a Dowsler homogenizer, each dissected lung subsection was sheared and homogenized with 10 ml of Suspension Medium buffer (SM; 1 M NaCl, 10 mM MgSO₄, 50 mM Tris-HCl pH 7.4) in a 50 ml Falcon tube, followed by centrifugation at 2000 rpm for 20 minutes to pellet tissue fragments. The supernatant was removed and processed as described in (2). In brief, samples were treated with an equal volume of dithiothreitol, incubated for 30 minutes at 37 ° C, homogenized, and passed through 0.8 micron and 0.45 micron filters to remove intact cells. The viral particles in each filtrate were isolated and concentrated in a cesium chloride gradient (3). The viral fractions were collected and treated with chloroform and DNase I. Each sample was verified to be free of contaminating cellular material using epifluorescence microscopy and 16S rDNA PCR prior to DNA isolation (3). Viral DNA was extracted using a CTAB/Formamide protocol as described in (3) and amplified using Phi29 polymerase to generate sufficient template DNA for 454 pyrosequencing. The amplified viral DNA was sequenced on the 454 GS-FLX instrument with multiplexing and Titanium chemistry according to the manufacturer's standard

protocols.

Initial bioinformatics of viral metagenomic sequences

Multiplexed viral metagenomic libraries were de-convoluted and de-replicated.

Taxonomic assignments were made by comparison to the non-redundant database at NCBI using BLASTn and tBLASTx (4). Any sequences with significant BLASTn or tBLASTx similarities to eukaryotic DNA or significant BLASTn similarities to bacterial or archaeal DNA ($e\text{-value} < 10^{-5}$) were removed from the metagenomes prior to further processing.

Viral taxonomic assignment

A custom database was constructed that included all completely sequenced viral genomes available at NCBI (<http://www.ncbi.nlm.nih.gov/sites/genome>) and all phage genomes in the phage proteomic tree (<http://www.phantome.org/>). Redundant genome sequences were removed. Viral taxonomy was assigned based on tBLASTx similarities to the database ($E\text{-value} < 10^{-5}$, $> 30\%$ similarity, $> 50\%$ query coverage). Viral community profiles were generated by GAAS using the top option (i.e., using only the top tBLASTx similarity), with no length normalization, requiring a minimum percent identity of 30% and minimum alignment length of 50% of the query, and with an $E\text{-value}$ cutoff of 10^{-5} (5).

Metagenomic reads were mapped to individual viral genomes using BLAT and coverage

plots generated by Circos for TTV-3 and HPV-49 and by the Integrated Genome Browser for Pf1 (6, 7). Accession numbers for the reference sequences used for coverage plots were NC_014081 (TTV-3 complete genome sequence), NC_001591 (HPV-49 complete genome sequence), and NC_001331 (*Pseudomonas* phage Pf1 complete genome sequence).

Diversity of viral metagenomes

Species richness was estimated for each virome using a similarity-independent method based on contig assembly (8, 9). Sequences from each virome were repeatedly sub-sampled using a sample size of 1000 sequences to yield 5X coverage and then assembled into contigs by Circonspect (<http://biome.sdsu.edu/Circonspect>). The resultant contig spectra were combined with average genome size estimates generated by GAAS using tBLASTx for analysis by PHACCS (5, 9). Richness estimates for all viromes are based on a logarithmic model, as this model produced the lowest error (9).

To compare the diversity between viromes, the most likely percentage of viral genotypes shared by each virome pair was calculated using MaxiPhi, a method that performs Monte Carlo simulations based on cross-contig spectra (8, 10). MaxiPhi results were combined using non-metric multi-dimensional scaling (NM-MDS) with the isoMDS function in the R package MASS. The percent of non-shared genotypes provided the distance metric used to create dissimilarity matrices for NM-MDS. To determine statistical significance empirically for the percentage of shared genotypes, a simulation was conducted. In brief, 100 artificial viral metagenomes were created

from the viral database described above using the program Grinder (<http://sourceforge.net/projects/biogrinder>). Each metagenome had a randomly determined species richness between 1 and 400 viral genotypes to simulate the range of diversity estimated for the viral metagenomes in this study. This set of metagenomes were compared pairwise to each other using MaxiPhi to create an empirical distribution of percent similarity values. Quantiles of this distribution were used to define statistical significance at the 5% and 1% levels.

Contig assembly and phylogenetic analysis

Viral contigs were assembled using the command line version of the CAP3 assembler and taxonomic assignments were made using BLASTn against the non-redundant database at NCBI (11). Open reading frames in the TTV contig were determined using Prodigal (12). The predicted ORF1 was aligned with all other anellovirus ORF1 protein sequences available from UniProt and phylogenetic analysis was performed using PhyML with 100 bootstrap repetitions (13).

Antibiotic resistance genes in viromes

To identify antibiotic resistance genes, virome sequences were compared to the Antibiotic Resistance Database (ARDB) using BLASTx (14). Similarities with E-values of $<10^{-5}$ over at least 80% of the query sequence length were considered significant. Statistically significant differences between antibiotic resistance determinants in different lobes were evaluated using the non-parametric statistical program XIPE (15). Viral contigs were generated using CAP3, translated in all six frames using TranSeq, and aligned to the sequence with the highest BLAST similarity

to determine the correct translation frame (11,16). The translated *mexF* contig from the explant lung was aligned to the set of non-redundant MexF sequences available from UniProt using ClustalW2 (17). Phylogenetic analysis of aligned MexF sequences was performed using MrBayes 3.1 with four independent Markov chains over 500,000 generations using the mixed amino acid model (18).

Caveats

Viral DNA extracted from all lobes was amplified using multiple displacement amplification with Phi29 polymerase prior to sequencing. Phi29 has been shown to preferentially amplify small circular DNAs and could artificially inflate the abundance of sequences from small circular genomes such as HPV and TTV (19,20). All of the pyrosequenced metagenomes used in this study were collected and processed in an identical manner, thus all samples were equally subject to any potential biases due to sampling or amplification. HPV or TTV present in any lobes would have been preferentially amplified and detected, further confirming the unique presence of HPV and TTV in distinct anatomical regions.

A second caveat concerns the risk of contamination of lung autopsy samples during excision and transport, as well as contamination with oral microbiota due to aspiration upon death. To prevent contamination, samples were processed upon receipt in the laboratory in a sterile hood using autoclaved reagents and tools. The large lung sections received were resected further so that only interior tissue (i.e. tissue which had not been previously been exposed to air during autopsy) was processed and used for viral DNA extraction. Although aspiration of

oropharyngeal contents can occur upon death, the autopsy report for this patient indicated that the patient had suffocated due to complete blockage of his central airways, including the trachea, by thick, purulent mucus. The tracheal mucus plug that was physically removed from the patient's trachea at autopsy had completely sealed off the airway, thus making aspiration of oropharyngeal contents into the lungs unlikely.

References

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Table E1. Characteristics of the viral metagenomes. Eukaryotic sequences were detected using BLASTn and tBLASTx comparisons to the non-redundant database. Sequences with similarities to eukaryotic genomes greater than 90% identity and e-values 10^{-5} were removed prior to further processing.

Lung	Region	Number of Sequences	Eukaryotic sequences (%)
Ex-plant	RUL	16,413	17 (0.10)
Ex-plant	RML	10,575	985 (9.31)
Ex-plant	RLL	10,295	2161 (20.99)
Ex-plant	LUL	24,743	52 (0.21)
Ex-plant	Ling	17,754	4463 (25.14)
Ex-plant	LLLA	44,547	16,368 (36.74)
Ex-plant	LLLP	12,584	443 (3.52)
Post-mortem	RUL	219,333	74,638 (34.03)
Post-mortem	RML	186,228	86,789 (46.60)
Post-mortem	RLL	264,916	121,470 (45.85)
Post-mortem	LUL	123,166	11,139 (9.04)
Post-mortem	Ling	140,683	64,989 (46.2)
Post-mortem	LLL	186,517	79,826 (42.8)

Table E2. Dissimilarity matrices for viral metagenomes in the ex-plant (A) and post-mortem (B) lungs. Each entry in the matrix represents the percentage of unshared viral genotypes in each pair of lung viromes as determined by MaxiPhi. Statistical significance was determined empirically using simulated metagenomes as described in methods. A dissimilarity index of 96.67% was the cutoff for significance at the 0.05 level (indicated by *) and an index of 99.21% was the cutoff at the 0.01 level (indicated by **).

A

	RUL	RML	RLL	LUL	Ling	LLLA	LLLP
RUL	0						
RML	83.33	0					
RLL	83.33	100**	0				
LUL	50	100**	100**	0			
LML	83.33	100**	100**	75	0		
LLLA	83.33	99*	64.81	83.33	79.55	0	
LLLP	100**	100	95.46	83.33	96.14	80	0

B

	RUL	RML	RLL	LUL	Ling	LLL
RUL	0.0					
RML	20.0	0.0				
RLL	57.0	0.5	0.0			
LUL	10.0	38.0	54.0	0.0		
Ling	11.0	85.0	81.0	20.0	0.0	
LLL	97.4*	95.1	97*	97*	99.3**	0.0

Figure E2. Taxonomic constituency (A,B) of lung viral metagenomes. Viral taxa were identified in the ex-plant (A) and post-mortem (B) lungs using tBLASTx to a custom viral database ($e < 0.00001$, percent similarity $> 30\%$, query coverage $> 50\%$). Each bar represents the presence of a different virus in the metagenome. Phage are grouped according to the taxonomy of their hosts, and phage of common CF pathogens are indicated in color: *Pseudomonas aeruginosa* in blue, *Burkholderia* spp. in green, *Haemophilus influenzae* in purple, and *Staphylococcus aureus* in red.

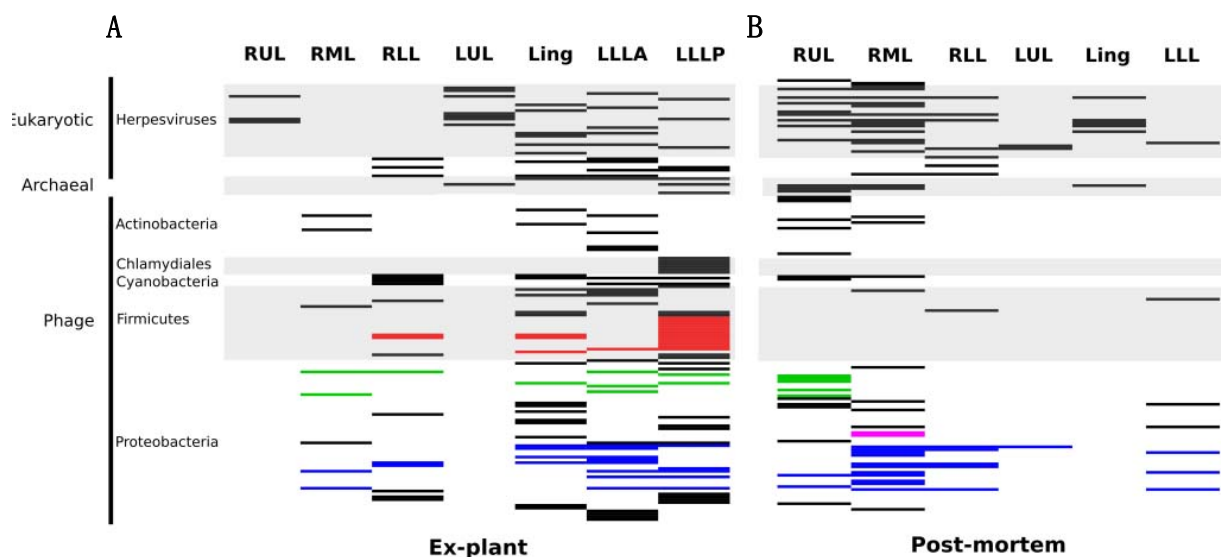


Figure E3. Phylogenetic relationships between predicted ORF1 of post-mortem lung RML Anellovirus contig and ORF1 sequences from known Anellovirus genomes. Numerical labels at branch points represent the percentage of bootstrap trees in which the sequences to the right of the branch point clustered together.

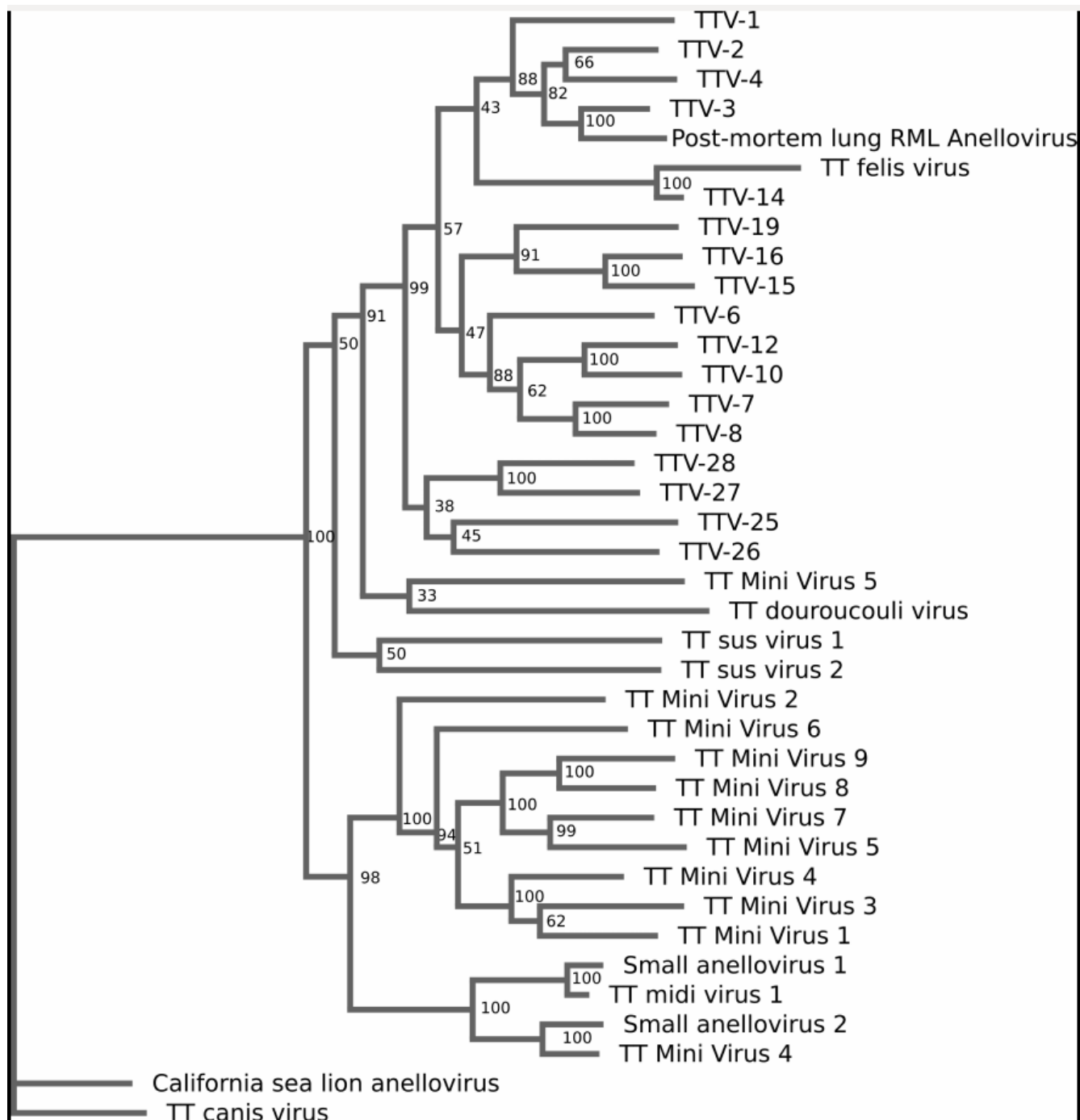


Figure E4. Coverage of phage Pfl genome by metagenomic sequences from the RML of the post-mortem lung. Each blue bar represents one sequence read. Thin regions of bars represent gaps in the sequence alignment.

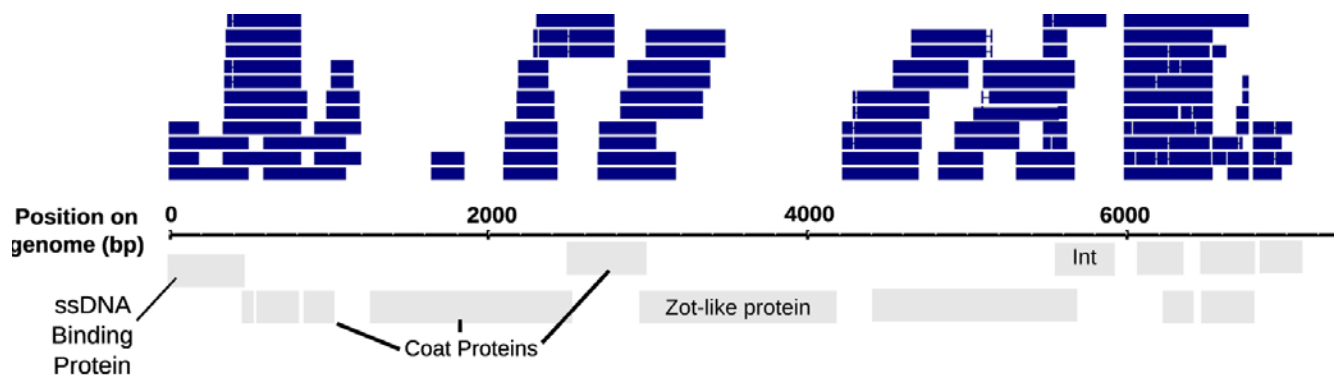


Figure E5. (A,B) Estimated richness of viral genotypes in the ex-plant (A) and post-mortem lungs (B) using contig assemblies of metagenomic sequences as implemented in PHACCs. (C,D) Non-metric multi-dimensional scaling based on the percent of shared viral genotypes between lobes of the ex-plant (C) and post-mortem (D) lungs. The percent of shared genotypes was calculated for each pair of viral metagenomes using MaxiPhi, which conducts Monte Carlo simulations based on cross-contig spectra to determine the relationship between viral communities (reference). The larger the distance between points on the MDS plots, the smaller the percentage of shared viral genotypes.

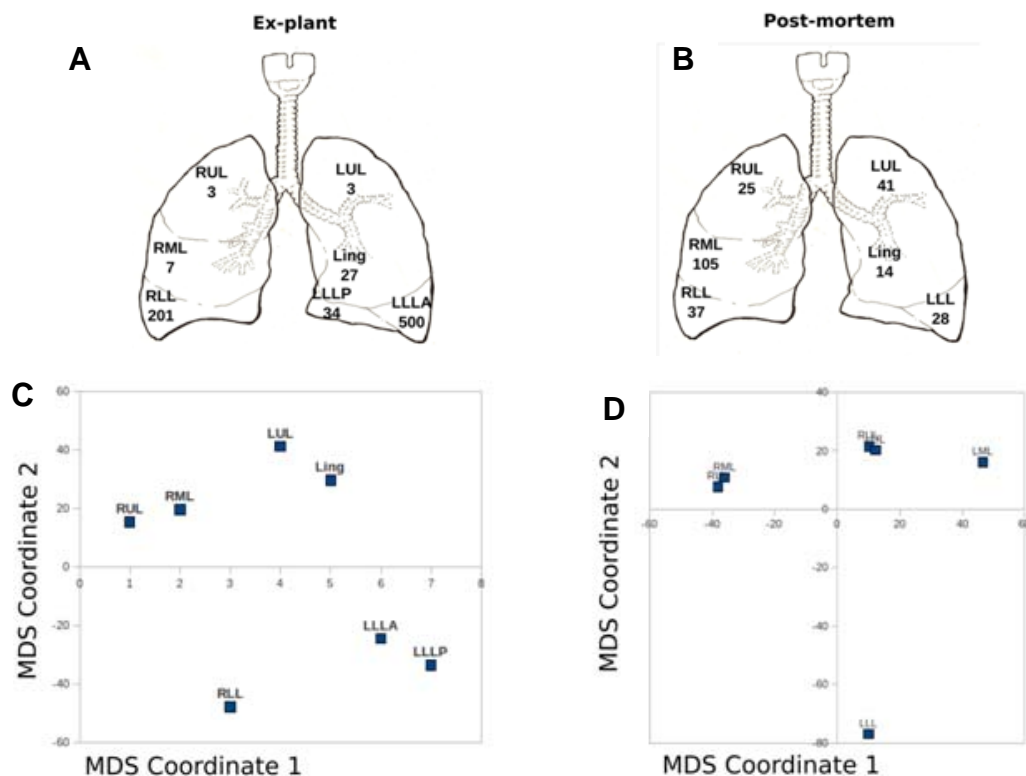


Figure E6. Phylogenetic relationships between the translated mexF sequence from the ex-plant lung RML and non-redundant mexF sequences from UniProt. Accession numbers for UniProt sequences appear in Table S3. Numbers at branch points indicate Bayes values, which represent the proportion of trees in which the sequences to the right of the branch point cluster together. Only non-unity (i.e. not equal to 1.00) Bayes values are shown.

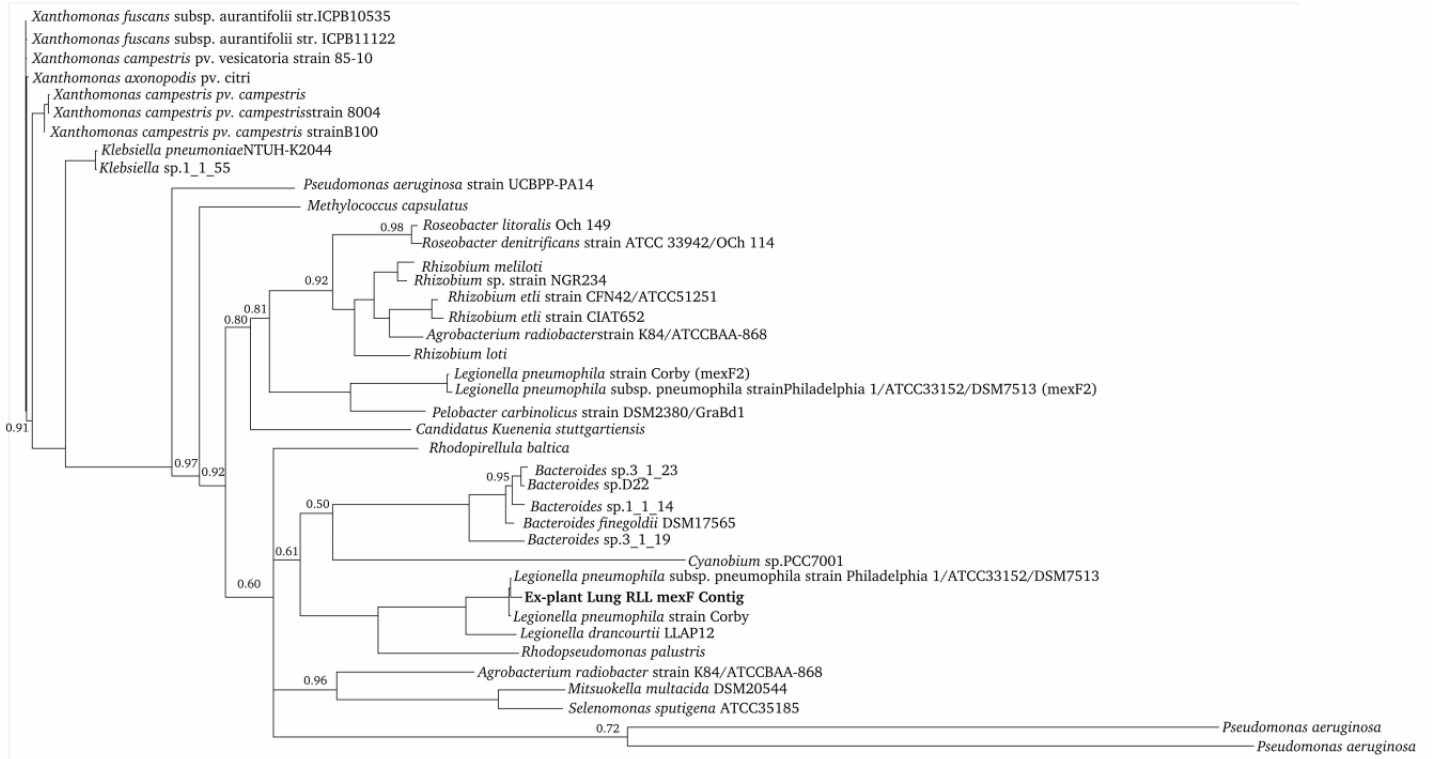
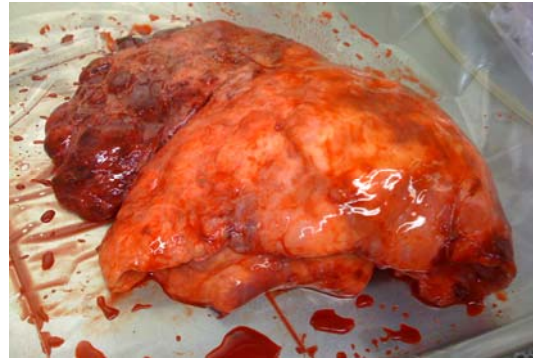


Figure E7. Gross pathology of ex-plant (A) and post-mortem (B) lungs. The ex-plant lungs were photographed intact just after extraction from the patient, and the post-mortem lungs were photographed following dissection at autopsy.

A)

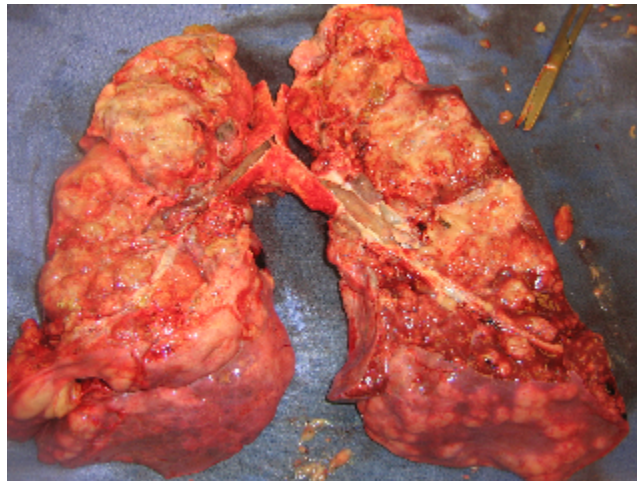


Right lung



Left lung

B)



Right lung

Left lung