

RESEARCH ARTICLE

Open Access



# Gene expression polymorphism underpins evasion of host immunity in an asexual lineage of the Irish potato famine pathogen

Marina Pais<sup>1†</sup>, Kentaro Yoshida<sup>1,2†</sup>, Artemis Giannakopoulou<sup>1,3</sup>, Mathieu A. Pel<sup>4</sup>, Liliana M. Cano<sup>1,5</sup>, Ricardo F. Oliva<sup>1,6</sup>, Kamil Witek<sup>1</sup>, Hannele Lindqvist-Kreuzer<sup>7</sup>, Vivianne G. A. A. Vleeshouwers<sup>4</sup> and Sophien Kamoun<sup>1\*</sup> 

## Abstract

**Background:** Outbreaks caused by asexual lineages of fungal and oomycete pathogens are a continuing threat to crops, wild animals and natural ecosystems (Fisher MC, Henk DA, Briggs CJ, Brownstein JS, Madoff LC, McCraw SL, Gurr SJ, *Nature* 484:186–194, 2012; Kupferschmidt K, *Science* 337:636–638, 2012). However, the mechanisms underlying genome evolution and phenotypic plasticity in asexual eukaryotic microbes remain poorly understood (Seidl MF, Thomma BP, *BioEssays* 36:335–345, 2014). Ever since the 19th century Irish famine, the oomycete *Phytophthora infestans* has caused recurrent outbreaks on potato and tomato crops that have been primarily caused by the successive rise and migration of pandemic asexual lineages (Goodwin SB, Cohen BA, Fry WE, *Proc Natl Acad Sci USA* 91:11591–11595, 1994; Yoshida K, Burbano HA, Krause J, Thines M, Weigel D, Kamoun S, *PLoS Pathog* 10:e1004028, 2014; Yoshida K, Schuenemann VJ, Cano LM, Pais M, Mishra B, Sharma R, Lanz C, Martin FN, Kamoun S, Krause J, et al. *eLife* 2:e00731, 2013; Cooke DEL, Cano LM, Raffaele S, Bain RA, Cooke LR, Etherington GJ, Deahl KL, Farrer RA, Gilroy EM, Goss EM, et al. *PLoS Pathog* 8:e1002940, 2012). However, the dynamics of genome evolution within these clonal lineages have not been determined. The objective of this study was to use a comparative genomics and transcriptomics approach to determine the molecular mechanisms that underpin phenotypic variation within a clonal lineage of *P. infestans*.

**Results:** Here, we reveal patterns of genomic and gene expression variation within a *P. infestans* asexual lineage by comparing strains belonging to the South American EC-1 clone that has dominated Andean populations since the 1990s (Yoshida K, Burbano HA, Krause J, Thines M, Weigel D, Kamoun S, *PLoS Pathog* 10:e1004028, 2014; Yoshida K, Schuenemann VJ, Cano LM, Pais M, Mishra B, Sharma R, Lanz C, Martin FN, Kamoun S, Krause J, et al. *eLife* 2:e00731, 2013; Delgado RA, Monteros-Altamirano AR, Li Y, Visser RGF, van der Lee TAJ, Vosman B, *Plant Pathol* 62:1081–1088, 2013; Forbes GA, Escobar XC, Ayala CC, Revelo J, Ordonez ME, Fry BA, Doucett K, Fry WE, *Phytopathology* 87:375–380, 1997; Oyarzun PJ, Pozo A, Ordonez ME, Doucett K, Forbes GA, *Phytopathology* 88:265–271, 1998). We detected numerous examples of structural variation, nucleotide polymorphisms and loss of heterozygosity within the EC-1 clone. Remarkably, 17 genes are not expressed in one of the two EC-1 isolates despite apparent absence of sequence polymorphisms. Among these, silencing of an effector gene was associated with evasion of disease resistance conferred by a potato immune receptor.

(Continued on next page)

\* Correspondence: [Sophien.Kamoun@tsl.ac.uk](mailto:Sophien.Kamoun@tsl.ac.uk)

<sup>†</sup>Marina Pais and Kentaro Yoshida contributed equally to this work.

<sup>1</sup>The Sainsbury Laboratory, Norwich Research Park, Colney Ln, Norwich NR4 7UH, UK

Full list of author information is available at the end of the article



(Continued from previous page)

**Conclusions:** Our findings highlight the molecular changes underpinning the exceptional genetic and phenotypic plasticity associated with host adaptation in a pandemic clonal lineage of a eukaryotic plant pathogen. We observed that the asexual *P. infestans* lineage EC-1 can exhibit phenotypic plasticity in the absence of apparent genetic mutations resulting in virulence on a potato carrying the *Rpi-vnt1.1* gene. Such variant alleles may be epialleles that arose through epigenetic changes in the underlying genes.

**Keywords:** Asexual reproduction, Clonal lineage, *Phytophthora infestans*, Emergent pathogen, Evolution, Immunity, Phenotypic plasticity, Expression polymorphism, Structural variation, Copy number variation, Loss of heterozygosity

## Background

Sexual reproduction is an important source of genetic diversity yet many asexual fungal and oomycete pathogens can rapidly adapt to their host environment and cause destructive pandemics [1–6]. Filamentous plant pathogens, including the soil-borne wilt fungus *Verticillium dahliae*, the rice and wheat blast fungus *Magnaporthe oryzae*, several rust fungi and *Phytophthora* spp. have widespread clonal populations that are a threat to managed and natural ecosystems as well as global food security [4, 7–14]. The establishment of these asexual populations is favored by agricultural practices such as monoculture and year-round crop production [15]. Therefore, asexual reproduction in plant pathogens is an important feature with serious epidemiological and agronomic implications [16, 17]. However, we know little about genome evolution and phenotypic plasticity in asexual lineages of plant pathogens, and to which degree genetic variation in these lineages affects the virulence profile of pandemic pathogen populations.

*Phytophthora infestans* is a heterothallic oomycete capable of both sexual and asexual reproduction [18, 19]. It causes the late blight disease in several plants in the Solanaceae genus *Solanum* and is renowned for its capacity to rapidly overcome resistant host cultivars [19, 20]. Successive emergence and spread of asexual lineages is a recurrent threat to potato cultivation and one of the main reasons why late blight remains the most destructive disease of potato worldwide [7, 16, 21, 22, 23]. Interestingly, there is evidence that phenotypic variation has emerged within clonal lineages of *P. infestans* with potential consequences on virulence [24, 25–28].

The asexual lineage EC-1 was first detected in 1990 in Ecuador as a dominant genotype with the A1 mating type and IIa mitochondrial haplotype [16, 24, 29]. In Ecuador and neighboring Colombia, EC-1 displaced the pandemic US-1 clone to dominate Andean populations of *P. infestans* associated with cultivated and wild potatoes [16, 24, 29–31]. As part of a population genomic study of ancient and modern *P. infestans* populations, we previously generated whole genome shotgun sequences of two EC-1 isolates, P13527 and P13626, using Illumina paired-end reads (~51- and 64-fold coverage, respectively)

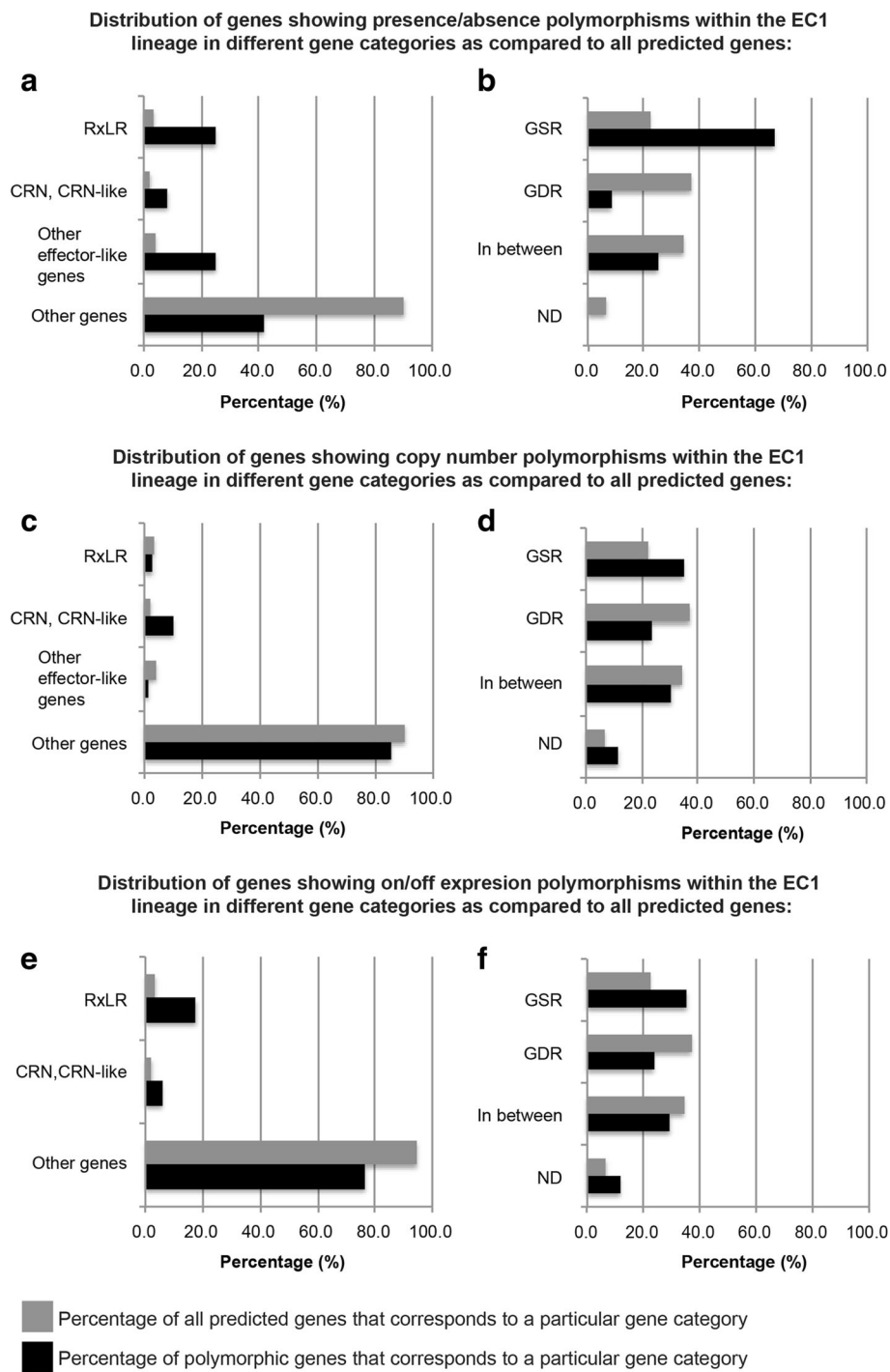
(Additional file 1: Tables S1, S2, S3) [16]. The objective of this study was to use a comparative genomics and transcriptomics approach to determine the molecular mechanisms that underpin phenotypic variation between members of the EC-1 clonal lineage of *P. infestans*.

## Results

### Genetic polymorphisms within the EC-1 clone

We first estimated levels of presence/absence polymorphisms and copy number variation (CNV) within EC-1. We aligned the sequence reads to the reference genome of *P. infestans* strain T30–4 [32] and calculated average breadth of read coverage and read depth per gene as previously described [7]. 62 and 60 of the 18,155 *P. infestans* genes were missing in the P13527 and P13626 genome sequences compared with T30–4, respectively (Additional file 1: Tables S4 and S5). Of these missing genes, 12 showed presence/absence polymorphisms between the two EC-1 isolates (Additional file 1: Table S6). In addition, 69 genes differed in copy number between the two EC-1 isolates (Additional file 1: Table S7). Interestingly, P13527 has a much higher number of copies than P13626 for the majority of the genes with CNV (61 out of 69, 88%) (Additional file 1: Table S7).

The *P. infestans* genome exhibits a discontinuous distribution of gene density with rapidly evolving disease effector genes localized to expanded, repeat-rich and gene-sparse regions (GSR) of the genome, in contrast to core ortholog genes, which occupy repeat-poor and gene-dense regions (GDR) [32, 33]. This “two-speed genome” architecture is thought to favor rapid evolution of the pathogen and facilitate adaptation to an ever-changing host environment [33, 34]. We noted that genes located in GSR were over-represented among the genes with presence/absence polymorphisms ( $p = 0.0012$ ) and CNV ( $p = 0.0112$ , although the GSR bias for CNV was not significant after Bonferroni correction), unlike other gene categories (Fig. 1b and d, Additional file 2: Figure S1). Genes encoding disease effectors were only over-represented among the genes with presence/absence polymorphisms ( $p = 3.9 \times 10^{-5}$ ), unlike other gene categories (Fig. 1b, Additional file 2: Figure S1). Among the 12 genes with presence/absence polymorphisms within



**Fig. 1** (See legend on next page.)

(See figure on previous page.)

**Fig. 1** Polymorphisms within the EC-1 lineage. The charts show the distribution of all predicted genes (grey bars) or genes showing polymorphisms within the EC-1 lineage (black bars) among different gene categories. **a** Percentage of RXLR effector genes, Crinkler (CRN) and CRN-like effector genes, other effector-like genes (including genes coding for small cysteine-rich proteins, protein inhibitors, hydrolases, etc.) and non-effector genes in the set of genes showing presence/absence polymorphisms between P13527 and P13626 compared to that in all the predicted genes. Genes encoding disease effectors are over-represented among the genes with presence/absence polymorphisms (one-tailed hypergeometric test,  $p = 3.9 \times 10^{-5}$ ). **b** Percentage of genes located in Gene Sparse Regions (GSR), Gene Dense Regions (GDR), in between GSR and GDR, and with location not determined (ND) in the set of genes showing presence/absence polymorphisms between P13527 and P13626 compared to that in all the predicted genes. Genes located in GSR are over-represented among the genes with presence/absence polymorphisms (one-tailed hypergeometric test,  $p = 0.0012$ ). **c** Percentage of RXLR effector genes, Crinkler (CRN) and CRN-like effector genes, other effector-like genes (including genes coding for small cysteine-rich proteins, protein inhibitors, hydrolases, etc.) and non-effector genes in the set of genes showing gene copy number (CN) polymorphisms between P13527 and P13626 compared to that in all the predicted genes. **d** Percentage of genes located in Gene Sparse Regions (GSR), Gene Dense Regions (GDR), in between GSR and GDR, and with location not determined (ND) in the set of genes showing gene copy number (CN) polymorphisms between P13527 and P13626 compared to that in all the predicted genes. Genes located in GSR are over-represented among the genes with CN polymorphisms (one-tailed hypergeometric test,  $p = 0.0112$ ). However, the GSR bias for CN polymorphisms is not significant after Bonferroni correction. **e** Percentage of RXLR effector genes, Crinkler (CRN) and CRN-like effector genes, other effector-like genes (including genes coding for small cysteine-rich proteins, protein inhibitors, hydrolases, etc.) and non-effector genes in the set of genes showing on/off expression polymorphisms between P13527 and P13626 compared to that in all the predicted genes. Genes encoding cytoplasmic effectors of the RXLR and CRN families are over-represented among the genes with on/off expression polymorphisms (one-tailed hypergeometric test,  $p = 0.0129$ ). **f** Percentage of genes located in Gene Sparse Regions (GSR), Gene Dense Regions (GDR), in between GSR and GDR, and with location not determined (ND) in the set of genes showing expression polymorphisms between P13527 and P13626 compared to that in all the predicted genes

EC-1, 8 are located in GSR, and 7 encode effector genes (Additional file 1: Table S6). The missing P13626 genes include 3 genes that have sequence similarity to the RXLR-type *Avr2* effectors, which are detected by immune receptors of the R2 class and, therefore, may reflect adaptation to host immunity [35, 36].

Next, we identified single nucleotide polymorphisms (SNPs) between P13527 and P13626, and compared the SNP frequencies to isolate 06\_3928A, which belongs to 13\_A2, a distinct clonal lineage of *P. infestans* [7]. The number of homozygous SNPs between the two EC-1 isolates was ~ 54-fold lower than between the EC-1 isolates and 06\_3928A, consistent with their expected genetic relationships (Additional file 1: Table S8). A large number of SNPs (> 327,000) occurred in heterozygous state within each of the individual EC-1 isolates (Additional file 1: Table S8). The number of these heterozygous SNPs was ~ 11-fold higher than homozygous SNPs between the EC-1 isolates and 06\_3928A, indicating the maintenance of a high level of genetic diversity at the heterozygous state within the EC-1 clonal lineage (Additional file 1: Table S8). About one third (111,144) of the heterozygous SNPs are shared between the EC-1 isolates and 06\_3928A, indicating that these sites were already polymorphic prior to the split between the EC-1 and 13\_A2 clonal lineages (Additional file 1: Table S9). The frequency of genes with homozygous and heterozygous SNPs was not dependent on genome localization and functional category (Additional file 2: Figure S2).

*Phytophthora* spp. are known to be prone to mitotic loss of heterozygosity (LOH), turning heterozygous genotypes to homozygous in the absence of sexual reproduction [37]. To estimate how many homozygous genotypes in segregating sites between P13527 and

P13626 were generated by LOH, we calculated the number of segregating sites where one of the EC-1 isolates has homozygous genotypes and the other EC-1 isolate and the 13\_A2 isolate 06\_3928A have heterozygous genotypes (Additional file 1: Table S9). By assigning the 13\_A2 isolate as an outgroup, heterozygous genotypes were estimated to be the ancestral type and homozygous genotypes were predicted to be the novel type generated by LOH in the population of EC-1 isolates, as the most parsimonious explanation. In total, we identified 140,852 heterozygous SNPs that are shared by the two clonal lineages. Of these, 19,983 (14.2%) are homozygous in P13527 and 9725 (6.9%) homozygous in P13626 indicating significant levels of LOH in EC-1 (Additional file 1: Table S9). LOH frequencies did not particularly vary depending on genome localization and functional category (Additional file 2: Figure S3). However, we identified 72 effector genes with high or moderate LOH nucleotide substitution effects based on the method of [38] (Additional file 1: Tables S10 and S11). Examples include the predicted RXLR effector PITG\_22925 in P13527 and Nep1-like protein PITG\_22916 in P13626, which became homozygous for an allele with a premature stop codon, as well as predicted RXLR effector PITG\_22922 in P13527 and CRN effector PITG\_06050 in P13626, which became homozygous for an allele with multiple nonsynonymous substitutions (Additional file 1: Tables S10 and S11).

#### Gene expression polymorphisms within the EC-1 clone

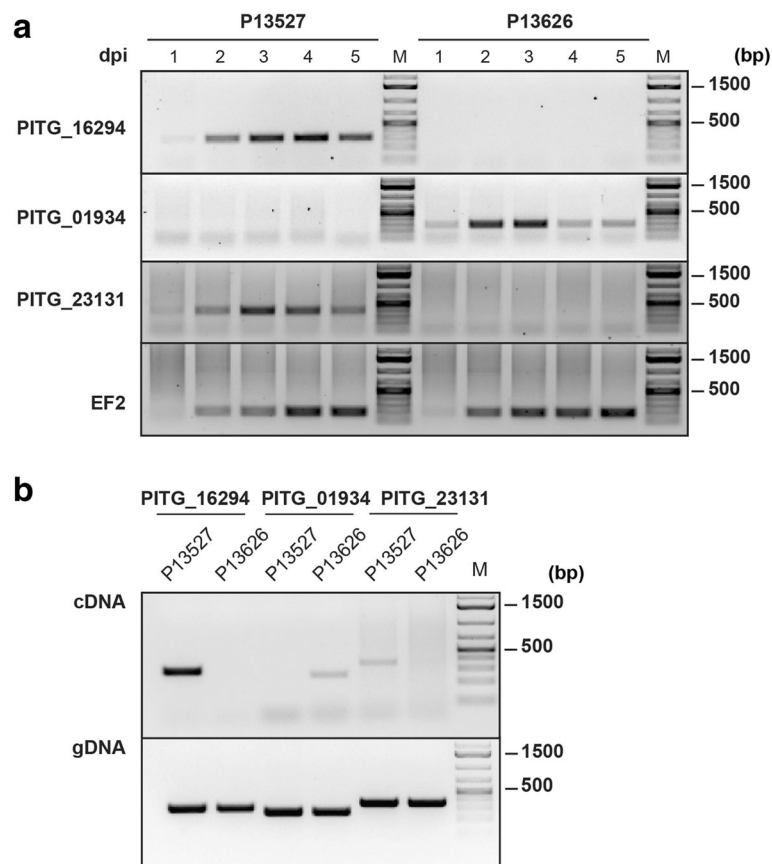
*P. infestans* is known to exhibit significant levels of gene expression polymorphisms [7]. Next, we investigated the degree to which the transcriptomes of the two EC-1 isolates diverge. We isolated RNA from potato leaves 2 days after inoculation with isolates P13527 and P13626, and

prepared and sequenced RNA-seq libraries using Illumina technology. We aligned the sequencing reads to the *P. infestans* T30–4 transcript sequences and estimated the counts per million (CPM) for each of the 18,155 genes. Gene expression of 13,703 genes was detected in at least one of the two isolates. A comparison of the gene expression between the isolates showed overall similarity (Pearson correlation coefficient = 0.967) (Additional file 2: Figure S4).

In total, 17 genes had no detectable RNA-seq reads in one of the two EC-1 isolates but were over the threshold CPM value in the other (see details in Methods). These genes had no fixed nucleotide differences between the two EC-1 isolates in the upstream (< 5 kbp), the coding and downstream (< 5 kbp) sequences based on alignments to the reference genome (Additional file 1: Table S12) (Additional file 2: Figure S5). However, of the 17 genes, 12 displayed nucleotide polymorphisms in heterozygous states in one of the two EC-1 isolates

(Additional file 1: Table S12, Additional file 2: Figure S5). Of the 17 genes, 14 genes were expressed in *P. infestans* isolate 06\_3928A, indicating that these genes were most likely silenced in the EC-1 lineage (Additional file 1: Table S12). Although these overall numbers are small, genes encoding cytoplasmic effectors of the RXLR and CRN families were over-represented among the genes with on/off expression polymorphisms ( $p = 0.0129$ ) (Fig. 1e). However, we did not note an enrichment in GSR located genes (Fig. 1f).

Among the genes with on/off expression polymorphisms, three encode RXLR effectors (Additional file 1: Table S12). To validate this finding, we isolated total RNA from potato leaves 1 to 5 days after inoculation with P13527 and P13626, and performed RT-PCR analyses (Fig. 2). We detected transcripts of PITG\_16294 and PITG\_23131 in P13527 samples but not in P13626 and transcripts of PITG\_01934 in P13626 only (Fig. 2). These expression patterns are consistent with the RNA-seq analyses and confirmed



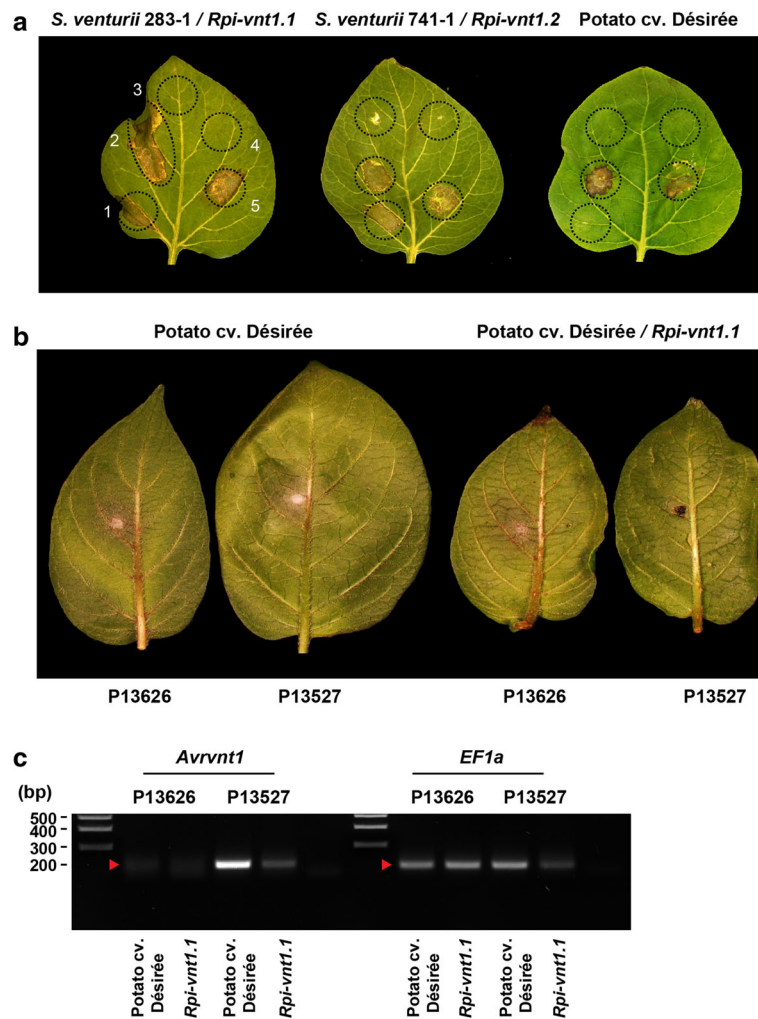
**Fig. 2** Validation of RXLR effector genes' expression polymorphisms between P13527 and P13626. **a** RT-PCR experiments performed with cDNA samples from infected potato leaves. Samples were collected from 1 to 5 days post-infection (dpi) with P13527 and P13626. Primers specific for the RXLR effector genes PITG\_16294, PITG\_01934 and PITG\_21131 were used for amplification. Amplification of the *EF2* (*Elongation Factor 2*) cDNA was included as positive control. 'M' indicates the lanes where a DNA molecular weight maker was loaded. **b** PCR experiments performed with cDNA (top panel) and gDNA (bottom panel) samples from P13527 and P13626 mycelia. Primers specific for the RXLR effector genes PITG\_16294, PITG\_01934 and PITG\_21131 were used for amplification. 'M' indicates the lanes where a DNA molecular weight maker was loaded

that the genes display expression polymorphisms within the EC-1 lineage.

**Loss of expression of the RXLR *Avrvnt1* effector gene is associated with virulence on resistant potatoes**

Plant pathogen effectors with an avirulence activity can trigger hypersensitive cell death when co-expressed *in planta* with their matching immune receptor even in the absence of the pathogen. In an independent set of experiments that aimed at identifying novel *P. infestans* avirulence effectors, we used *Agrobacterium tumefaciens*-mediated transient transformation (agroinfiltration) to express a collection of 240 RXLR effectors in *Solanum venturii* genotype vnt283–1 carrying the *Rpi-vnt1.1* resistance gene [39]. Six

candidates consistently triggered a cell death response typical of hypersensitivity (> 70% on a range of 0 (no) -100% (confluent) cell death) (Additional file 1: Table S13). Among these, PITG\_16294, one of the three RXLR effectors with an expression polymorphism within EC-1, was the only one to trigger cell death only in genotypes that carry the *Rpi-vnt1.1* gene, including a population of 95 individuals that segregate for this resistance gene (Additional file 1: Table S14). To confirm that PITG\_16294 activates *Rpi-vnt1.1*, we co-expressed the two genes in the susceptible potato cv. Désirée (Fig. 3a). We detected hypersensitive cell death only when PITG\_16294 is co-expressed with *Rpi-vnt1.1* or the closely related resistance gene *Rpi-vnt1.2* (Fig. 3a). Altogether, these



**Fig. 3** Identification of *Avrvnt1* as the cognate effector for *Rpi-vnt1*. **a** Agroinfiltration of *Avrvnt1* leads to cell death in *Solanum venturii* 283–1 and 741–1 carrying *Rpi-vnt1.1* and *Rpi-vnt1.2*, respectively, but not in susceptible potato cultivar Désirée; (1): *Avrvnt1*, (2): *Avrvnt1* and *Rpi-vnt1.1*, (3): *Rpi-vnt1.1*, (4): empty vector pK7WG2 was used as a negative control in this experiment, (5): *R3a* and *Avr3a* were used as a positive control *R/Avr* pair in this experiment. Note that co-expression of *Avrvnt1* and *Rpi-vnt1.1* in potato cultivar Désirée (2, leaf on right side) also results in hypersensitive cell death. **b** Differential virulence of P13626 and P13527 on plants expressing *Rpi-vnt1.1*. **c** RT-PCR experiments performed with cDNA samples from infected potato leaves. Samples were collected at 3 days post-infection (dpi) with P13626 and P13527. Primers specific for the RXLR effector gene PITG\_16294 were used for amplification. Amplification of the *EF1a* (*Elongation Factor 1a*) cDNA was included as positive control

results indicate that PITG\_16294 is *Avrvnt1*, the effector that activates *Rpi-vnt1* immunity.

These results prompted us to test whether the two EC-1 isolates show differential virulence on potato plants expressing the *Rpi-vnt1.1* resistance gene. We used the P13527 and P13626 isolates to inoculate transgenic potato cv. Désirée lines expressing *Rpi-vnt1.1*. The two isolates produced strikingly different phenotypes on these plants (Fig. 3b). Whereas P13527 triggered a local immune reaction typical of the hypersensitive response, P13626 infected *Rpi-vnt1.1* potato. Both isolates were virulent on potato cv. Désirée, which is not known to carry any effective resistance gene against *P. infestans*. RT-PCR on the infected plants confirmed the reduced biomass of the avirulent P13527 on *Rpi-vnt1.1* potato and the absence of PITG\_16294 transcripts in P13626 (Fig. 3c). We conclude that evasion of *Rpi-vnt1.1*-mediated resistance is probably conferred by absence of PITG\_16294 (*Avrvnt1*) transcripts.

## Discussion

Our study revealed the molecular changes underpinning phenotypic plasticity in a pandemic asexual lineage of *P. infestans*. We determined that the EC-1 clonal lineage undergoes significant levels of diversification at the sequence and gene expression level. For the most part, we did not observe the patterns of genome evolution previously described in *P. infestans* possibly because in the present study we examined a shorter evolutionary timescale compared to earlier intra- and inter-specific comparative studies [7, 32, 33]. Therefore, the two-speed genome concept applies only to a limited degree to the relatively recent radiation of the EC-1 asexual lineage. Nonetheless, genes in GSR appeared to exhibit higher levels of structural variation. Linking genome architecture to accelerated adaptive evolution can also be relevant to the micro evolutionary timescales observed in agricultural systems. Field pathogen monitoring must, therefore, probe beyond genotyping and genome sequencing to take into account phenotypic plasticity as exemplified by the observed gene expression polymorphisms. In order to fully capture pathogen evolutionary dynamics, approaches based on RNA-seq, such as the recently developed field pathogenomics method [10, 14] must be used to complement classical population genetics studies.

We observed that the asexual EC-1 lineage can exhibit phenotypic plasticity in the absence of apparent genetic mutations resulting in a dramatic increase in virulence on a potato carrying the *Rpi-vnt1.1* gene. Such variant alleles may be epialleles that arose through epigenetic processes in the underlying genes as observed in other plant pathogens [40–42]. A recent report shows that DNA methylation in the form of N6-methyladenine (6mA) is an epigenetic mark of *P. infestans* that could be

linked to adaptive evolution in this pathogen [43]. By contrast, the 5-methylcytosine (5mC) modification has not been detected in *P. infestans* [43, 44]. Furthermore, changes in histone post-translational modifications and chromatin remodelling could play a role in these processes too [44]. However, it is also possible that a genetic trigger, possibly a cis- or trans-structural variant, has resulted in the absence of *Avrvnt1* transcripts. Nonetheless, our observation that on/off expression polymorphisms may predominantly affect effector genes points to a potential adaptive process. In the future, understanding the genetic basis of the processes that underlie expression polymorphism and gene silencing is critical to fully appreciate the evolutionary potential of asexual plant pathogen lineages [45, 46].

## Conclusion

Asexually reproducing organisms are generally thought to be less able to cope with rapid environmental changes due to the lack of genetic recombination. Nonetheless, asexual lineages of fungal and oomycete pathogens can cause lasting disease outbreaks and are known to evolve to evade host immunity when exposed to disease-resistant hosts. We analyzed genetic and gene expression polymorphisms in the *P. infestans* clonal lineage EC-1. EC-1 was first detected in the 1990s and is thought to be a relatively young asexual lineage. Despite this, we documented a notable level of genetic and gene expression polymorphisms. In particular, silencing of the RXLR effector gene *Avrvnt1* enabled virulence on a resistant potato cultivar. Our findings shed light on the mechanisms underlying genome evolution and phenotypic plasticity in an economically important plant pathogen, and highlight the capacity of asexual filamentous pathogens to adapt to rapid environmental changes.

## Methods

### Genome sequencing and analyses

Genomic DNA extraction from mycelia of *P. infestans* isolates P13527, P13626 and 06\_3928A, library preparation and Illumina next-generation sequencing reactions were performed as described in [7] using the Illumina Genome Analyzer IIx (Illumina). The expected length of the paired-end reads generated was 76 bp. Sequencing reads with lengths different from 76 bp as well as reads containing Ns were removed with in-house scripts. Filtered Illumina reads were aligned to the reference genome sequence of *P. infestans* T30–4 [32] with the Burrows-Wheeler Transform Alignment (BWA) software. Average breadth of read coverage, read depth per gene and gene copy numbers were calculated as described in [7]. Genes with no coverage were considered absent. Copy numbers were estimated from the Average Read Depth (ARD) as previously described [7]. ARD for

the coding sequence of a gene 'g' (ARD [g]) was calculated and adjusted according to GC content. Adjusted ARD for a gene 'g' (AARD [g]) belonging to the  $i^{\text{th}}$  GC content percentile was obtained by the formula  $\text{AARD [g]} = \text{ARD [g]} * \text{mARD} / \text{mARD}_{\text{GC}}$  where mARD is the overall mean depth of all coding sequences and  $\text{mARD}_{\text{GC}}$  is the mean depth for genes in the  $i^{\text{th}}$  GC content percentile. Copy Number for a gene 'g' (CN [g]) was calculated as  $\text{AARD [g]} / \text{mARD}$ . Copy Number Variation for a gene 'g' (CNV [g]) was calculated as  $\text{CN [g]} \text{ in P13527} - \text{CN [g]} \text{ in P13626}$ . Genes with the same CN in both isolates will have  $\text{CNV [g]} = 0$ . Genes with  $\text{CNV [g]} \geq 1$  or  $\text{CNV [g]} \leq -1$  were considered as having copy number polymorphisms between P13527 and P13626. *P. infestans* isolates P13527 and P13626 are from World Oomycete Genetic Resource Collection at UC Riverside, CA as described in [16]. Isolate 06\_2938A was obtained from outbreaks of potato late blight across Great Britain (GB) as previously described in [7].

We used the same set of homozygous and heterozygous SNPs in [16]. SNPs were called by comparing each isolate with the T30-4 genome sequence. Allele counts for each position were estimated using pileup from SAMtools [47]. SNPs were called as high quality if depth coverage of reads was  $\geq 10$ . If a high-quality SNP had been detected in the other strains, SNPs with depth coverage of reads  $\geq 3$  were rescued. Allele concordance  $\geq 80\%$  was regarded as homozygous SNPs, and allele concordance between 20 and 80% was regarded as heterozygous SNPs. The details of SNP calling were described in [16]. Synonymous and nonsynonymous (missense and nonsense) SNPs were estimated using snpEff [38].

### RNA sequencing and analyses

Total RNA was extracted from infected potato leaves at 2 days after inoculation using the Plant RNeasy Kit (QIAGEN). Infection methods followed for this work are described below. Two micrograms of total RNA were used for construction of cDNA libraries using the TruSeq RNA Sample Prep Kit (Illumina) according to the manufacturer's instruction. The libraries were used for paired-end sequencing with  $2 \times 76$  cycles on Illumina Genome Analyzer IIx (Illumina). Adapter sequences were removed from sequencing reads using cutadapt. Sequencing reads containing Ns were discarded, and then unpaired reads were removed using the perl script "cmpfastq\_pe" ([http://compbio.brc.iop.kcl.ac.uk/software/cmpfastq\\_pe.php](http://compbio.brc.iop.kcl.ac.uk/software/cmpfastq_pe.php)).

Paired sequencing reads were aligned to the T30-4 consensus transcript sequences using Bowtie2 version 2.1.0. To remove potential PCR artifacts, duplicates of paired sequencing reads, which were exactly mapped to the same positions, were removed using MarkDuplicates of Picard version 1.113. Reads mapped

to each transcript sequences were counted with "samtools idxstats" of SAMtools version 0.1.19. Count per million (CPM) for each transcript was calculated.

To search for on/off gene expression polymorphisms between the two EC-1 isolates, a threshold value of CPM was defined based on the comparison between RNA-Seq data and microarray data [7] of the 13\_A2 isolate 06\_3928A from potato leaves 2 days after inoculation. At first, we estimated cumulative distribution of CPM for the transcripts that showed 2-fold induction in planta compared with mycelia in microarray data (Additional file 2: Figure S5). Of these transcripts, 95% had over 18 CPM, and then 18 CPM was set as threshold of expression of genes when the genes showed zero CPM in one of the isolates. This means that when the gene showed zero CPM in one of the isolates and less than 18 CPM in the other, the gene was not regarded as a gene showing on/off expression polymorphisms. For the scatter plot, variance stabilizing transformation of the count was calculated using DESeq [48]. Subtraction from the transformed value corresponding to  $\text{CPM} = 0$  from a value of each gene was used as adjusted values of variance stabilizing transformation.

### Enrichment analyses

Gene annotations and locations described in Additional file 1: Table S15 were used to categorise genes showing polymorphisms in the genome and transcriptome analyses. Location of genes in Gene Sparse Regions (GSR), Gene Dense Regions (GDR), in between GSR and GDR, and with location not determined (ND) is based on [33]. Hypergeometric tests were performed for enrichment analysis to detect effector bias and GSR bias in the sets of polymorphic genes (Additional file 3). "phyper" in the R Stats Package was used for the one-tailed hypergeometric tests. Alpha value was set to 0.05. After Bonferroni correction, alpha values for genetic polymorphisms and expression polymorphisms were 0.003 and 0.025, respectively. Considering that genetic and expression polymorphisms are independent biological phenomena and were detected based on different approaches (genome sequencing and RNA sequencing), the multiple corrections were individually applied.

### Validation of expression polymorphisms

To validate expression polymorphisms in RXLR effector genes, detached Désirée potato leaves were drop-inoculated with 50,000 zoospores/mL of *P. infestans* P13527 or P13626. Zoospores were harvested from P13527 or P13626 mycelia grown in Rye Sucrose Agar (RSA) plates for 10–12 days at 18°C by adding cold sterile distilled water and incubating for 2 h, at 4°C. The resulting zoospores' suspension was diluted to 50,000 zoospores/mL with cold sterile distilled water and 10  $\mu\text{L}$



droplets were used to inoculate detached leaves. Inoculated leaves were kept in closed trays with high moisture under controlled environmental conditions (18°C, 16 h of light and 8 h of dark). Leaf disks harbouring the inoculation site were collected at 1, 2, 3, 4 and 5 days after inoculation. For each time point, disks corresponding to different leaflets from five different plants were pooled and RNA was extracted with the Plant RNeasy Kit (QIAGEN). For RNA and genomic DNA extraction from mycelia, P13527 and P13626 were grown in modified plich medium as described in [7]. Mycelia grown independently in different plates were pooled and used to perform RNA extraction with the Plant RNeasy Kit (QIAGEN) or genomic DNA extraction with the Omniprep Kit (G-Biosciences). For RT-PCR experiments, 5–10 µg of total RNA from infected leaf tissue and from mycelia were subject to DNase treatment with the TURBO DNA-free Kit (Ambion). cDNA synthesis was performed with 500 ng of DNase-treated RNA using the SuperScript III First-Strand Synthesis System (Invitrogen) and oligo-dT primers. cDNA (1 µL) and genomic DNA (200 ng) samples were then used as template in PCRs using DreamTaq DNA Polymerase (Thermo Scientific), following manufacturer's instructions. Primers used were 5'-TAACGACCC CGACCAAGTTA-3' and 5'-AGAGATGCCAGCCT TTCGTA-3' for PITG\_16294, 5'-AGTGGTGCTCTCGG CGACTCT-3' and 5'-AGCCCCTCCGTTTCCTGGG T-3' for PITG\_01934, 5'-ATGCGTCTACCGGTACATG TACGT-3' and 5'-CTAGTCGTAGTTACGCGTCT-3' for PITG\_23131, and 5'-GTCATTGCCACCTACTTC-3' and 5'-CATCATCTTGTCCTCAGC-3' for the *Elongation Factor 2* (*EF2*) control. Presence/absence of amplification products was evaluated in 1–1.5% agarose gels and the GeneRuler 1 kb Plus DNA Ladder (Thermo Scientific) was used to assess amplicon size.

#### Effectomics screen and validation of PITG\_16294's avirulence activity

To identify novel *P. infestans* avirulence effectors a set of 240 RXLR effectors was synthesized at GenScript (New Jersey, USA). Each effector was obtained in pUC57 vector and sub-cloned by Gateway LR cloning into a binary expression vector. The final expression vector was transferred into *Agrobacterium tumefaciens* strain AGL01 and used to perform a screen in *Solanum venturii* genotype vnt283–1 carrying the *Rpi-vnt1.1* resistance gene [39].

Agroinfiltration of RXLR effectors and/or *R* genes was carried out on wild potato species or Désirée potato plants according to Du and Vleeshouwers [49]. The abaxial side of leaves of four-week-old plants was infiltrated using *A. tumefaciens* cultures with a final OD<sub>600</sub> = 0.3. Infiltrated leaves were scored 4 days after agroinfiltration to assess the presence of cell death.

#### Assessment of differential virulence on potato plants carrying *Rpi-vnt1*

Fully developed leaves of 10-week old *Rpi-vnt1.1* and wild type Désirée plants were detached and infected with 10 µL drops of a 50,000 zoospores/mL suspension of *P. infestans* P13527 or P13626, as described above. Inoculated leaves were incubated for 3 days under controlled environmental conditions (18°C, 16 h of light and 8 h of dark). Disks of 1 cm diameter were cut from the areas showing *P. infestans* infection, and used directly for RNA isolation using TRI Reagent (Sigma-Aldrich), according to manufacturer's protocol. For each sample, 10 µg of total RNA was treated with DNase I (Thermo Fisher Scientific) and 1 µg of treated RNA was used for first-strand cDNA synthesis with a mix of oligo-dT and random hexamer primers, using SuperScript II First-Strand Synthesis System (Invitrogen). Diluted cDNA (1 µL of a 1,5 dilution) was used for PCR with gene specific primers (F: 5'-CGAAGTTGACGGCT CCTG-3', R: 5'-GGCTCGCTTGAACAAATCC-3'), and with control primers for *Elongation Factor 1α* (*EF1α*) (F: 5'-GTCATTGCCACCTACTTC-3', R: 5'-CATCATCTT GTCCTCAGC-3'). Reactions were performed in 25 µL with 30 amplification cycles (annealing temperature 60°C for both primer pairs) and using homemade Taq polymerase. PCR products were visualized on 1% agarose gel.

#### Additional files

**Additional file 1:** This file contains Supplemental Table S1. to S15. and their legends. (XLSX 1698 kb)

**Additional file 2:** This file contains Supplemental Figure S1. to S5. and their legends. (PDF 749 kb)

**Additional file 3:** One-tailed hypergeometric tests performed for enrichment analyses to assess effector bias and GSR bias in the sets of polymorphic genes. (PDF 242 kb)

#### Abbreviations

CNV: Copy number variation; CPM: Counts per million; GDR: Gene-dense regions; GSR: Gene-sparse regions; LOH: Loss of heterozygosity; SNPs: Single nucleotide polymorphisms

#### Acknowledgements

We thank members of our laboratories for discussions and comments.

#### Funding

This project was funded by the Gatsby Charitable Foundation, Biotechnology and Biological Sciences Research Council (BBSRC), European Research Council (ERC), FP6 program BioExploit Food-CT-2005-513959. The project also received funding by the COST Action SUSTAIN FA1208. KY was supported by a Japan Society for the Promotion of Science (JSPS) Postdoctoral Fellowship for Research Abroad. Research by HLK was undertaken as part of, and funded by, the CGIAR Research Program on Roots, Tubers and Bananas (RTB) and supported by CGIAR Fund Donors (<https://www.cgiar.org/funders/>). Funders had no role in the design of the study and collection, analysis, and interpretation of data.

#### Availability of data and materials

All data generated or analyzed during this study are included in this published article (and its supplementary information files).

**Authors' contributions**

MP, MAP, KY, VGA AV and SK designed the project. AG, MP, KY, VGA AV and SK wrote the manuscript. MP, MAP, RFO, KW, HLC carried out experiments. MP, KY and LMC performed analysis of genetic and expression polymorphisms. All authors read and approved the final manuscript.

**Ethics approval and consent to participate**

Not applicable.

**Competing interests**

The authors declare that they have no competing interests.

**Publisher's Note**

Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

**Author details**

<sup>1</sup>The Sainsbury Laboratory, Norwich Research Park, Colney Ln, Norwich NR4 7UH, UK. <sup>2</sup>Graduate School of Agricultural Science, Kobe University, Kobe, Japan. <sup>3</sup>National Hellenic Research Foundation, Institute of Biology, Medicinal Chemistry & Biotechnology, Athens, Greece. <sup>4</sup>Wageningen UR Plant Breeding, Wageningen, The Netherlands. <sup>5</sup>Institute of Food and Agricultural Sciences, Department of Plant Pathology, Indian River Research and Education Center, University of Florida, Fort Pierce, FL, USA. <sup>6</sup>Genetics and Biotechnology Division, International Rice Research Institute, Los Baños, Philippines. <sup>7</sup>International Potato Center, Lima, Peru.

Received: 24 July 2017 Accepted: 22 May 2018

Published online: 05 July 2018

**References**

- Fisher MC, Henk DA, Briggs CJ, Brownstein JS, Madoff LC, McCraw SL, Gurr SJ. Emerging fungal threats to animal, plant and ecosystem health. *Nature*. 2012;484(7393):186–94.
- Kupferschmidt K. Attack of the clones. *Science*. 2012;337(6095):636–8.
- Seidl MF, Thomma BP. Sex or no sex: evolutionary adaptation occurs regardless. *BioEssays*. 2014;36(4):335–45.
- de Jonge R, Bolton MD, Kombrink A, van den Berg GC, Yadeta KA, Thomma BP. Extensive chromosomal reshuffling drives evolution of virulence in an asexual pathogen. *Genome Res*. 2013;23(8):1271–82.
- Farrer RA, Henk DA, Garner TW, Balloux F, Woodhams DC, Fisher MC. Chromosomal copy number variation, selection and uneven rates of recombination reveal cryptic genome diversity linked to pathogenicity. *PLoS Genet*. 2013;9(8):e1003703.
- Castagnone-Sereno P, Danchin EG. Parasitic success without sex - the nematode experience. *J Evol Biol*. 2014;27(7):1323–33.
- Cooke DEL, Cano LM, Raffaele S, Bain RA, Cooke LR, Etherington GJ, Deahl KL, Farrer RA, Gilroy EM, Goss EM, et al. Genome analyses of an aggressive and invasive lineage of the Irish potato famine pathogen. *PLoS Pathog*. 2012;8(10):e1002940.
- Ebbole DJ. *Magnaporthe* as a model for understanding host-pathogen interactions. *Annu Rev Phytopathol*. 2007;45:437–56.
- Goellner K, Loehrer M, Langenbach C, Conrath U, Koch E, Schaffrath U. *Phakopsora pachyrhizi*, the causal agent of Asian soybean rust. *Mol Plant Pathol*. 2010;11(2):169–77.
- Hubbard BP, Badran AH, Zuris JA, Guilinger JP, Davis KM, Chen L, Tsai SQ, Sander JD, Joung JK, Liu DR. Continuous directed evolution of DNA-binding proteins to improve TALEN specificity. *Nat Methods*. 2015;12(10):939–42.
- Leonard KJ, Szabo LJ. Stem rust of small grains and grasses caused by *Puccinia graminis*. *Mol Plant Pathol*. 2005;6(2):99–111.
- Short DPG, Gurung S, Gladieux P, Inderbitzin P, Atallah ZK, Nigro F, Li G, Benlioglu S, Subbarao KV. Globally invading populations of the fungal plant pathogen *Verticillium dahliae* are dominated by multiple divergent lineages. *Environ Microbiol*. 2015;17(8):2824–40.
- Grünwald NJ, Goss EM, Press CM. *Phytophthora ramorum*: a pathogen with a remarkably wide host range causing sudden oak death on oaks and ramorum blight on woody ornamentals. *Mol Plant Pathol*. 2008;9(6):729–40.
- Islam MT, Croll D, Gladieux P, Soanes DM, Persoons A, Bhattacharjee P, Hossain MS, Gupta DR, Rahman MM, Mahboob MG, et al. Emergence of wheat blast in Bangladesh was caused by a south American lineage of *Magnaporthe oryzae*. *BMC Biol*. 2016;14(1):84.
- Stukenbrock EH, McDonald BA. The origins of plant pathogens in agro-ecosystems. *Annu Rev Phytopathol*. 2008;46:75–100.
- Yoshida K, Schuenemann VJ, Cano LM, Pais M, Mishra B, Sharma R, Lanz C, Martin FN, Kamoun S, Krause J, et al. The rise and fall of the *Phytophthora infestans* lineage that triggered the Irish potato famine. *eLife*. 2013;2:e00731.
- Singh RP, Hodson DP, Jin Y, Lagudah ES, Ayliffe MA, Bhavani S, Rouse MN, Pretorius ZA, Szabo LJ, Huerta-Espino J, et al. Emergence and spread of new races of wheat stem rust fungus: continued threat to food security and prospects of genetic control. *Phytopathology*. 2015;105(7):872–84.
- Judelson HS, Blanco FA. The spores of *Phytophthora*: weapons of the plant destroyer. *Nat Rev Microbiol*. 2005;3(1):47–58.
- Fry W. *Phytophthora infestans*: the plant (and R gene) destroyer. *Mol Plant Pathol*. 2008;9(3):385–402.
- Vleeshouwers VG, Raffaele S, Vossen JH, Champouret N, Oliva R, Segretin ME, Rietman H, Cano LM, Lokossou A, Kessel G, et al. Understanding and exploiting late blight resistance in the age of effectors. *Annu Rev Phytopathol*. 2011;49:507–31.
- Goodwin SB, Cohen BA, Fry WE. Panglobal distribution of a single clonal lineage of the Irish potato famine fungus. *Proc Natl Acad Sci U S A*. 1994; 91(24):11591–5.
- Fry WE, Birch PR, Judelson HS, Grunwald NJ, Danies G, Everts KL, Gevens AJ, Gugino BK, Johnson DA, Johnson SB, et al. Five reasons to consider *Phytophthora infestans* a reemerging pathogen. *Phytopathology*. 2015; 105(7):966–81.
- Fry WE, McGrath MT, Seaman A, Zitter TA, McLeod A, Danies G, Small IM, Myers K, Everts K, Gevens AJ, et al. The 2009 late blight pandemic in the eastern United States – causes and results. *Plant Dis*. 2013;97(3):296–306.
- Forbes GA, Escobar XC, Ayala CC, Revelo J, Ordonez ME, Fry BA, Doucett K, Fry WE. Population genetic structure of *Phytophthora infestans* in Ecuador. *Phytopathology*. 1997;87(4):375–80.
- Kamoun S, van der Lee T, Van den berg-Velthuis G, de Groot KE, Govers F. Loss of production of the elicitor protein INF1 in the clonal lineage US-1 of *Phytophthora infestans*. *Phytopathology*. 1998;88(12):1315–23.
- Stephen B, Goodwin LSS, Fry WE. Rapid evolution of pathogenicity within clonal lineages of the potato late blight disease fungus. *Phytopathology*. 1995;85(6):669–76.
- Sujkowski LS, Goodwin SB, Fry WE. Changes in specific virulence in Polish populations of *Phytophthora infestans*: 1985–1991. *Eur J Plant Pathol*. 1996; 102(6):555–61.
- Samen FM, Secor GA, Gudmestad NC. Variability in virulence among asexual progenies of *Phytophthora infestans*. *Phytopathology*. 2003;93(3):293–304.
- Yoshida K, Burbano HA, Krause J, Thines M, Weigel D, Kamoun S. Mining herbaria for plant pathogen genomes: back to the future. *PLoS Pathog*. 2014;10(4):e1004028.
- Delgado RA, Monteros-Altamirano AR, Li Y, Visser RGF, van der Lee TAJ, Vosman B. Large subclonal variation in *Phytophthora infestans* populations associated with Ecuadorian potato landraces. *Plant Pathol*. 2013;62(5):1081–8.
- Oyarzun PJ, Pozo A, Ordonez ME, Doucett K, Forbes GA. Host specificity of *Phytophthora infestans* on tomato and potato in Ecuador. *Phytopathology*. 1998;88(3):265–71.
- Haas BJ, Kamoun S, Zody MC, Jiang RHY, Handsaker RE, Cano LM, Grabherr M, Kodira CD, Raffaele S, Torto-Alalibo T, et al. Genome sequence and analysis of the Irish potato famine pathogen *Phytophthora infestans*. *Nature*. 2009;461(7262):393–8.
- Raffaele S, Farrer RA, Cano LM, Studholme DJ, MacLean D, Thines M, Jiang RHY, Zody MC, Kunjeti SG, Donofrio NM, et al. Genome evolution following host jumps in the Irish potato famine pathogen lineage. *Science*. 2010; 330(6010):1540–3.
- Dong S, Raffaele S, Kamoun S. The two-speed genomes of filamentous pathogens: waltz with plants. *Curr Opin Genet Dev*. 2015;35:57–65.
- Gilroy EM, Breen S, Whisson SC, Squires J, Hein I, Kaczmarek M, Turnbull D, Boevink PC, Lokossou A, Cano LM, et al. Presence/absence, differential expression and sequence polymorphisms between *PIAVR2* and *PIAVR2-like* in *Phytophthora infestans* determine virulence on R2 plants. *New Phytol*. 2011;191(3):763–76.
- Saunders DGO, Breen S, Win J, Schornack S, Hein I, Bozkurt TO, Champouret N, Vleeshouwers VGAA, Birch PRJ, Gilroy EM, et al. Host protein BSL1 associates with *Phytophthora infestans* RXLR effector AVR2 and the *Solanum demissum* immune receptor R2 to mediate disease resistance. *Plant Cell*. 2012;24(8):3420–34.
- Lamour KH, Mudge J, Gobena D, Hurtado-Gonzales OP, Schmutz J, Kuo A, Miller AJ, Rice BJ, Raffaele S, Cano LM, et al. Genome sequencing and

- mapping reveal loss of heterozygosity as a mechanism for rapid adaptation in the vegetable pathogen *Phytophthora capsici*. *Mol Plant-Microbe Interact.* 2012;25(10):1350–60.
38. Cingolani P, Platts A, Wang le L, Coon M, Nguyen T, Wang L, Land SJ, Lu X, Ruden DM. A program for annotating and predicting the effects of single nucleotide polymorphisms, SnpEff: SNPs in the genome of *Drosophila melanogaster* strain w1118; iso-2; iso-3. *Fly.* 2012;6(2):80–92.
  39. Foster SJ, Park TH, Pel M, Brigneti G, Sliwka J, Jagger L, van der Vossen E, Jones JD. *Rpi-vnt1.1*, a *Tm-2<sup>2</sup>* homolog from *Solanum venturii*, confers resistance to potato late blight. *Mol Plant-Microbe Interact.* 2009;22(5):589–600.
  40. Qutob D, Chapman BP, Gijzen M. Transgenerational gene silencing causes gain of virulence in a plant pathogen. *Nat Commun.* 2013;4:1349.
  41. Na R, Yu D, Chapman BP, Zhang Y, Kuflu K, Austin R, Qutob D, Zhao J, Wang Y, Gijzen M. Genome re-sequencing and functional analysis places the *Phytophthora sojae* avirulence genes *Avr1c* and *Avr1a* in a tandem repeat at a single locus. *PLoS One.* 2014;9(2):e89738.
  42. Qutob D, Tedman-Jones J, Dong S, Kuflu K, Pham H, Wang Y, Dou D, Kale SD, Arredondo FD, Tyler BM, et al. Copy number variation and transcriptional polymorphisms of *Phytophthora sojae* RXLR effector genes *Avr1a* and *Avr3a*. *PLoS One.* 2009;4(4):e5066.
  43. Chen H, Shu H, Wang L, Zhang F, Li X, Ochola S, Mao F, Ma H, Ye W, Gu T, et al. *Phytophthora* methylomes modulated by expanded 6mA methyltransferases are associated with adaptive genome regions. *bioRxiv.* 2017. <https://doi.org/10.1101/217646>.
  44. van West P, Shepherd SJ, Walker CA, Li S, Appiah AA, Grenville-Briggs LJ, Govers F, Gow NA. Internuclear gene silencing in *Phytophthora infestans* is established through chromatin remodelling. *Microbiology.* 2008;154(Pt 5): 1482–90.
  45. Gijzen M, Ishmael C, Shrestha SD. Epigenetic control of effectors in plant pathogens. *Front Plant Sci.* 2014;5:638.
  46. Soyer JL, El Ghalid M, Glaser N, Ollivier B, Linglin J, Grandaubert J, Balesdent MH, Connolly LR, Freitag M, Rouxel T, et al. Epigenetic control of effector gene expression in the plant pathogenic fungus *Leptosphaeria maculans*. *PLoS Genet.* 2014;10(3):e1004227.
  47. Li H, Handsaker B, Wysoker A, Fennell T, Ruan J, Homer N, Marth G, Abecasis G, Durbin R. The sequence alignment/map format and SAMtools. *Bioinformatics.* 2009;25(16):2078–9.
  48. Anders S, Huber W. Differential expression analysis for sequence count data. *Genome Biol.* 2010;11(10):R106.
  49. Du J, Vleeshouwers VG. The do's and don'ts of effectoromics. *Methods Mol Biol.* 2014;1127:257–68.

Ready to submit your research? Choose BMC and benefit from:

- fast, convenient online submission
- thorough peer review by experienced researchers in your field
- rapid publication on acceptance
- support for research data, including large and complex data types
- gold Open Access which fosters wider collaboration and increased citations
- maximum visibility for your research: over 100M website views per year

At BMC, research is always in progress.

Learn more [biomedcentral.com/submissions](https://biomedcentral.com/submissions)

