The fate of horizontally acquired genes: rapid initial turnover followed by long-term persistence

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A major driver of bacterial evolution is horizontal gene transfer (HGT), the acquisition of genes from other strains or species. Transfers between closely related taxa are more likely to succeed, while the pervasive deletion bias of bacterial genomes drives frequent turnover of horizontally acquired genes. However, whether the rate of gene loss after acquisition is constant across lineages or time remains unclear. Here, we analyze a comprehensive dataset of bacterial genomes to infer the frequency, distribution, and retention of inter-phylum HGT events. The retention of inter-phylum gene transfers is highly skewed, with only a small subset of bacterial genomes accounting for the majority of such events. Most transferred genes are lost rapidly. Those genes that survive the initial purging are retained over long periods, are biased toward functions such as transport and metabolism, and have larger numbers of protein-protein interactions.

Introduction

Horizontal gene transfer (HGT) is a key driver of prokaryotic evolution (1, 2), even if its role in environmental adaptations may have been overestimated (3). Unlike vertical inheritance, HGT facilitates the exchange of genetic elements across phylogenetic boundaries, profoundly shaping bacterial evolution and ecological diversification.

Evidence indicates that most horizontally acquired genes originate from phylogenetically related donors rather than from distantly related taxa. This pattern likely reflects both selective pressures and mechanistic barriers to gene flow between divergent lineages, such as constraints imposed by genome architecture, functional compatibility, and integration with host regulatory networks (4–7). Although horizontal transfer of genes between bacteria from different phyla (inter-phylum HGT) is less frequent than within-phylum transfer, it has nonetheless been documented in notable cases, for instance, in the transfer of genes from archaea to bacteria at the origin of certain archaeal clades (8, 9). While such events are considered rare, their impact on recipient genomes can be substantial. Although it is difficult to estimate the frequency of inter-phylum HGT, Sheinman et al. (7) reported that approximately 8% of bacterial genomes harbor DNA segments identical to those in other phyla, indicating that inter-phylum gene transfer is not uncommon. Nevertheless, because these DNA segments may not always function as expressed genes, the functional relevance of such horizontally transferred sequences – and whether all bacterial clades are equally susceptible to inter-phylum HGT – remains unclear.

Furthermore, studies on sets of closely related species indicate that the retention of newly acquired genes is often transient; empirical studies indicate that the majority of horizontally transferred genes are rapidly lost following their initial acquisition (10–12). However, it is unclear if this pattern of rapid loss holds generally across bacteria.

Here, we employ a systematic, sequence-identity-based method for HGT inference to analyze patterns of gene loss across a comprehensive dataset of $> 33,000$ bacterial genomes. Our approach differentiates between very recent and slightly older inter-phylum HGT events and examines their persistence, functional categorization, and involvement in protein–protein interaction networks. The horizontal acquisition of potentially functional genes from other phyla is very rare; however, a quarter of the genomes that contain any inter-phylum gene acquisitions harbor genes from multiple gene families. We observe that horizontally acquired genes are initially lost at a high rate; those retained appear to be very stable afterwards and display distinct functional characteristics compared to genes eliminated early. Collectively, these findings support a two-phase model of post-transfer gene loss and broaden our understanding of the evolutionary forces shaping the retention of horizontally acquired genes.

Results and Discussion

Inference of recent inter-phylum gene transfers. We analyzed 35,439 gene families from 33,918 extant bacterial genomes, obtained from the EggNOG database v6 (13), which clusters genes into non-supervised orthologous groups (NOGs; referred to as gene families below). Horizontal gene transfer (HGT) was inferred by identifying, within a gene family, pairs of genes with high sequence identity that are found in two different phyla as defined by NCBI Taxonomy (14). In this framework, a horizontally acquired gene is represented as a pair of homologous genes from different taxa. Sequence identity — the percentage of identical amino acids – was calculated from the multiple sequence alignments (MSA) of EggNOG gene families. The distribution of such gene pairs across percent sequence identities is shown in Fig. 1. The direction of transfer (i.e., which gene in the pair is from the donor taxon and which from the recipient) was inferred by examining the outgroup of the most

recent common ancestor in the gene tree; if one phylum is represented in the outgroup and the other is not, directionality can be assigned, i.e., we can identify which genome is the recipient and which is the donor (see Methods). The vast majority of gene families contain no inter-phylum gene pairs with sequence identities above 80%. We find candidate inter-phylum HGT gene pairs in 796 gene families and 4,445 genomes for downstream analyses.

Fig. 1. Recent inter-phylum HGTs can be distinguished from vertically inherited genes from sequence identities. Distribution of sequence identities of gene pairs in a gene family such that the pair of genes are from two different phyla. The dotted line indicates the estimated cutoff for HGT inference, above which we consider the gene pairs to be horizontally transferred.

The overall distribution of inter-phylum gene pairs exhibits three major trends: a prominent peak at 100% sequence identity, an approximately uniform distribution at intermediate sequence identities, and a gradual increase as sequence identity decreases further. For comparison, we performed the same analysis to identify candidate inter-class and inter-order HGT pairs. For these, the increase in frequency begins at much higher sequence identities (Suppl. Fig. S1). This pattern suggests that gene pairs with lower sequence identity primarily result from vertical inheritance, as vertically inherited genes within the same family will be more similar among more closely related taxa. We conclude that pairs of genes from different taxonomic groupings with high sequence identities, including those at 100% sequence identity, are predominantly the results of HGT.

Accordingly, we applied a sequence identity cutoff of 91.75% to identify gene pairs from inter-phylum HGT. This threshold corresponds to the point at which the smoothed frequency distribution of sequence identities flattens when moving from lower to higher sequence identities (see Methods and Suppl. Fig. S2).

For two highly similar homologous genes found in two genomes from different phyla, sequence identity is an approximate measure of the number of substitutions since their last common ancestor, and can thus serve as a proxy for the time that has passed since the HGT event. Even without the assumption of a molecular clock, one can distinguish approximately between recent and older transfers by considering the inter-phylum gene pairs that are identical versus the ones that are not. Accordingly, we classified pairs with 100% sequence identity as *recent* transfers, whereas those with sequence identities below 100% but above the cutoff are regarded as *older* (albeit still relatively recent) transfers. The majority of inter-phylum gene pairs identified as HGTs (84.51% or 4,245 of 5,023) are older transfers.

Inferences of HGT from high sequence similarity between phyla are highly precise. Neighboring genes are frequently co-acquired (15–17), and inference methods that identify a higher fraction of such co-acquisitions are generally considered to infer fewer false positives. Accordingly, HGT inference methods can be benchmarked based on how often co-acquisitions were inferred for neighboring genes in the target genome (18). We used this strategy to check the accuracy of our sequence identity-based HGT inference method, which does not use position information of the genes for its inferences. It appears to perform on par with the best-performing methods in Mishra and Lercher (18); note, however, that the performances are not directly comparable, as our dataset differs from the one used in the previous benchmark.

Across all inter-phylum transfers, 3.83% of gene pairs inferred to be co-acquired within the same genome are neighbors in the target genome. Among co-transferred gene pairs (i.e., pairs of HGTs where both genes have the same donor and recipient genome), the majority (81.09%) are neighbors in the target genome.

We estimated the probability of finding a single identical gene pair in our dataset that results from vertical inheritance from the common ancestor of two phyla – the family-wise error rate (FWER) – to be approximately 2.81×10^{-10} (see Methods). This low rate of false positives, combined with the high percentage of neighboring co-acquisitions, suggests that the inferred inter-phylum HGT events are reliable, although the actual number of inter-phylum transfers may be higher than what we can detect in this dataset.

Inter-phylum gene acquisitions are concentrated in a few genomes. The distribution of the number of inter-phylum HGTs per genome is highly skewed, with most genomes (98.16%; 33294 of 33918) not hosting any inter-phylum HGTs that are recent enough to pass our filters. Only 0.57% (195 of 33918) of the genomes in our dataset (195 out of 33,918) are involved in any relatively recent inter-phylum HGT event for which we could infer the direction of transfer. Of these, only about a quarter (53 out of 195) show evidence of recent transfers, while most (180 out of 195) only harbour older transfers. Only about a quarter of the genomes involved in inter-phylum HGTs (26.7%, or 52 out of 195) received genes from more than one gene family, and only 3.1% (6 out of 195) received genes from more than 5 gene families (Fig. 2a) These genomes belong to diverse phyla, with no single phylum dominating the distribution of inter-phylum

HGTs (see Suppl. Table S1 for lineage information). Fig. 2b shows that recent inter-phylum HGTs are also concentrated in a handful of bacterial genomes.

Fig. 2. The distribution of inter-phylum HGTs is strongly skewed. Rank plot of the number of inter-phylum gene acquisitions per genome. The x-axis shows the genomes ranked by number of inter-phylum HGTs, while the y-axis shows the number of gene families with inter-phylum HGTs where the direction of transfer is known. **(a)** All inter-phylum HGTs. **(b)** Recent inter-phylum HGTs.

The loss rate of horizontally acquired genes shows two phases. The pronounced peak of inter-phylum gene pairs at 100% sequence identity in Fig. 1 indicates that a large proportion of horizontally acquired genes are lost shortly after their acquisition: only few of these genes are still present after enough time has passed for the gene pair to have accumulated even a small number of substitutions. The near-uniform distribution across lower identity levels implies that very few genes are lost at later stages. The pronounced peak at 100% sequence identity, immediately followed by a near-uniform distribution, is also seen for inter-order and inter-class HGT (Suppl. Fig. S1). Thus, gene loss following HGT appears to generally follow a two-phase dynamic: an early phase of rapid loss, followed by long-term retention of the remaining genes.

Recent and older transfers differ systematically in functional categories and connectivity. How do horizontally acquired genes that persist in their host genome differ from those eliminated in the early, high-turnover phase? To answer this question, we used Clusters of Orthologous Groups (COG) functional category annotations in EggNOG. We performed a Fisher's exact test to check if the proportion of HGT pairs in a given COG category differs between recent and older HGT pairs. After correcting for multiple hypothesis testing (19), we observed that compared to recent inter-phylum acquisitions, older transfers are significantly depleted in the COG categories of (J) translation, ribosomal structure and biogenesis, (K) transcription, (L) replication, recombination and repair, (U) intracellular trafficking, secretion, and vesicular transport, and (V) defense mechanisms. Conversely, we observed a significant enrichment in older gene acquisitions in a number of transport and metabolism categories: (E) amino acid transport and metabolism, (H) coenzyme transport and metabolism, and (P) inorganic ion transport and metabolism. This result is consistent with the complexity hypothesis (20), which posits that genes that are successfully transferred belong more frequently to operational functional categories, such as metabolism and transport, than to informational ones, such as transcription and translation.

Fig. 3. Recent and older inter-phylum transfers differ systematically in their functions. Odds ratios (OR) of COG categories depleted (OR>1) and enriched (OR<1) in older transfers. Error bars show 95% confidence intervals. Red markers indicate COG categories that are significantly enriched (adjusted $p \leq 0.05$ after correcting for multiple testing). The dashed line at OR=1 indicates no difference between recent and older transfers.

The rationale behind the complexity hypothesis is that genes in the information-processing functional categories are more complex in the sense of having more interaction partners, and are thus less likely to integrate successfully into the interaction network of a new host (20, 21). One therefore expects that genes transferred more frequently have a lower connectivity in terms of protein-protein interactions (PPI), a prediction that was previously confirmed in a much more limited dataset of older transfers (21).

We used the STRING database v11 (22) to obtain the number of PPI for every gene in our HGT dataset based on STRING's own gene family clustering and a minimum STRING interaction score of 900 (max: 1000). Although we observe a

marginal negative correlation between the number of HGTs inferred for a gene family and the mean PPI of the gene family (Spearman's $\rho = -0.14$ and -0.11 for recent and older transfers, respectively), neither of these correlations is statistically significant ($p = 0.08$ and $p = 0.18$ respectively; see Suppl. Fig. S3).

However, we find that the mean PPI across all gene pairs involved in older transfers is significantly higher than that across all gene pairs in recent transfers (6.95 vs. 5.99, $p = 0.033$ from a permutation test). Thus, genes involved in older transfers have on average one more protein-protein interaction partner than those involved in recent transfers.

Discussion

Our analysis shows that inter-phylum transfers of potentially functional genes are rare: less than 2% of genomes have been involved – either as donor or recipient – in any inter-phylum HGTs that our methodology can infer. However, when focusing on those events for which we can infer the direction of transfer, a quarter of those genomes that contain any inter-phylum gene acquisition harbor acquisitions from multiple gene families. We observed that the probability of a randomly selected genome harboring an inter-phylum gene acquisition is 0.57%. Consequently, if all inter-phylum gene acquisitions occurred independently, the expected probability for a genome to acquire a second acquisition after the first would again be 0.57%, two orders of magnitude lower than the observed 26.7%. This observation suggests that once a genome has acquired a gene from another phylum, it becomes considerably more likely to acquire additional inter-phylum genes.

When inter-phylum gene acquisitions occur, the acquired genes follow a biphasic trajectory. A brief, intense purge removes most of the newcomers, while the remaining genes appear to be surprisingly stable and are retained over extended time periods. The fast, early attrition matches qualitatively the findings of Puigbò et al. (10), who reported a loss rate roughly three times higher than the rate of acquisition. Lineage-specific bursts of inter-phylum gene acquisitions have been described for individual species and genera (23, 24), lending further support to our findings.

The two phases of losing genes acquired through inter-phylum HGT likely reflect the same evolutionary processes that are responsible for the pronounced differences between intra-population polymorphisms, which are characterized by negative selection and drift, and inter-population substitutions, characterized by positive selection (25, 26). Thus, it appears likely that the most recent inter-phylum HGTs detected in our study are not fixed in the respective populations, but are polymorphism specific to the genomes that were deposited in the EggNOG database.

The complexity hypothesis (20) predicts that operational genes are more frequently transferred than informational ones. Our results align with this prediction: compared to very recent inter-phylum gene acquistions, older (yet still relatively recent) transfers are depleted in categories such as transcription, translation, replication/recombination/repair, intracellular trafficking, and defense – several of which represent informational functions. In contrast, genes that survived the early loss phase predominantly participate in operational roles, such as transport and metabolism.

The original formulation of the complexity hypothesis emphasized – without empirical support – the greater connectivity and functional entanglement of informational genes, a view that was supported by a more limited, earlier analysis of older transfers across different phylogenetic distances (21). However, our data reveal a different trend. Genes that undergo initial purging of horizontally acquired genes have, on average, more interaction partners than the most recent transfers. Thus, the observed functional biases likely reflect functional adaptations more than the sheer complexity initially proposed.

Our sequence similarity-based HGT inference approach offers precision that – based on neighboring co-acquisitions – is comparable to the best state-of-the-art methods at highest stringency, but focussed on relatively recent HGT events. However, it is inherently limited to detecting HGT between gene pairs covered by the dataset examined. Increasing both genome and gene family diversity would enable more accurate detection of gene similarities across clades, yielding a more complete picture of inter-phylum HGT. Sheinman et al. (7) observed that 8% of bacterial genomes share identical DNA segments with other phyla. That we observed a lower number of less than 2% likely reflects our focus on genes rather than DNA segments, as well as a more limited dataset. While the results of the two studies are not directly comparable, this discrepancy suggests that most inter-phylum DNA segment exchanges may not yield functional genes.

Together, our findings clarify the rarity and rapid attrition of inter-phylum horizontal gene transfers in bacteria, while highlighting the selective processes shaping their long-term retention. Future studies that combine broader genome sampling will be essential to map the ecological and molecular contexts in which such transfers persist.

Materials and Methods

Data and implicit phylogenetic method for HGT inference. Sequence identity, the number of substitutions, mismatches, and other relevant metrics were calculated for every gene pair within each NOG using multiple sequence alignments (MSA) from the EggNOG database. EggNOG also provides COG functional annotations for each gene family. Taxonomic information was retrieved from the NCBI Taxonomy via the Entrez API implemented through the Biopython library (14, 27). To infer the direction of HGT, gene trees available in EggNOG were used to identify appropriate outgroups. PPI data were obtained from STRING v11, considering only pairs of gene families with a minimum interaction score of 900 out of 1000 (22). Chromosomal positions of genes were also extracted from the STRING database.

To improve tractability and reduce noise, analyses were performed on a curated subset of the data. Specifically, only NOGs containing at least 10 taxa (to exclude very small groups) and a maximum of 2,000 genes were included. This subset comprised 33,918 genomes representing 35,439

NOGs across all bacterial phyla. For downstream analyses in this study, we further focused only on the 4,445 genomes containing 796 NOGs in which gene pairs exhibited sequence identity above 80% and originated from two different phyla. A subset of these gene pairs are inferred to be horizontally transferred based on our sequence identity cutoff.

Although recent transfers are defined as those with 100% sequence identity, to consider older transfers we identify a sequence identity cutoff based on the point where distribution of sequence identities flattens out. The distribution was smoothed using a rolling average with a window size of 5% sequence identity across bins of width 0.5%, excluding the bin for identical sequence matches. The cutoff was set at the point where the derivative of the smoothed distribution reached zero, indicating a plateau in the distribution.

Family-wise error rate for recent HGT. We assume that substitutions at each site follow a Poisson process. Then, the probability that a site undergoes no amino acid substitutions over a branch length d (the mean number of substitutions per site) is e^{-d}. For a gene of length L, the probability that all sites are unchanged is then

$$P_{\text{identical}} = e^{-dL}$$

Across M independent gene pairs, the probability that no pair is identical by chance is $(1 - P_{\text{identical}})^M$. Then, the probability that at least one gene pair is identical by chance – the family-wise error rate (FWER) – is one minus this probability, i.e.,

$$\text{FWER} = 1 - (1 - e^{-dL})^M \quad .$$

For our dataset, we estimate d as 4.94 substitutions per site, M as $\approx 10^9$ (number of gene pairs), and L as 267.41 (average gene length in number of amino acids). This leads to an estimate of FWER ≈ 0, i.e., a very low probability of false positives in our HGT inference.

Outgroup for inferring direction of transfer and co–transfers. For any potential HGT in a gene family, the pair of genes must have two different taxonomic groupings at the taxonomic level of interest. Let A and B be two taxonomic groupings represented in a gene family tree, with gene members A_1 and B_1. If the outgroup of A_1 and B_1 has genes from A and not from B, then the direction of transfer is from the taxon containing A_1 to the taxon containing B_1, and vice versa. If two pairs of genes are inferred to be transferred from the same donor taxon to the same recipient taxon, we define it as a co-transfer. If they have the same recipient taxon, but not necessarily the same donor taxon, we define it as a co-acquisition. We limit our analysis of co-transfers and co-acquisitions to the gene pairs where the direction of transfer could be inferred.

Functional categories for PPI analysis. We use the COG (Clusters of Orthologous Groups) functional categories as defined in NCBI COG (28), since EggNOG gene families already use these annotations for categorizing the NOGs. Fisher's exact test was performed with a contingency table

comparing the number of recent vs older HGT gene pairs, in a COG vs those not in the COG. The reliance on gene pairs introduces a potential for overestimation: in cases where several genomes within the same family are highly similar and only one belongs to a different phylum, multiple gene pairs may be labeled as HGT even if they result from a single transfer event.

Permutation tests were performed with 10^4 iterations of randomly shuffling whether a gene pair is a recent or older transfer, and then calculating the mean PPI for the pair of genes. The p-value is calculated as the fraction of iterations where the mean PPI of the older transfers is greater than that of the recent transfers. These gene families across the two sets are not independent, since a gene family can have both recent and older transfers. However, the permutation test is still valid, since the null hypothesis is that the mean PPI of the two sets of gene pairs is equal.

Code and data availability

The code used for the analyses in this study is available on Gitlab (https://gitlab.cs.uni-duesseldorf.de/general/ccb/imli).
The corresponding data is available at Zenodo (https://doi.org/10.5281/zenodo.16745487).

Competing interests

The authors have declared no competing interest.

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