Supplementary Material

Raw datasets

All raw datasets can be downloaded form the following URL:

• http://lab.dessimoz.org/13_bbh

Additional experiments on simulated data (bacteria tree)

| | $\% \ {f Duplications}$ | | | | | | |
|-----------------------------|-------------------------|-----------|--------------|-------------------|----------|----------|--------|
| | equ | al loss i | rate | varyi | ng relat | ive loss | s rate |
| | 20 | 30 | 40 | 10 | 30 | 30 | 40 |
| parameters values | | | | | | | |
| # of sequences | 1000 | | | | | | |
| distr. of seq. length | | | $\Gamma(k =$ | = $2.4, \theta =$ | 133.8) | | |
| min. sequence length | | | | 50 | | | |
| substitution model | WAG | | | | | | |
| insertion and deletion rate | | | | 0.000125 | 5 | | |
| gene duplication rate | 0.006 | 0.0105 | 0.017 | 0.0026 | 0.0087 | 0.009 | 0.0125 |
| gene loss rate | 0.006 | 0.0105 | 0.017 | 0.0078 | 0.0029 | 0.027 | 0 |
| # of species | 30 | | | | | | |
| key statistics | | | | | | | |
| seq. length - mean | 321.6 | 324.4 | 323.7 | 323.1 | 317.9 | 320.9 | 324.6 |
| seq. length - stderr | 205.5 | 210.9 | 207.1 | 208.9 | 201.2 | 205.8 | 207.2 |
| avg. % gap chars in MSA | 22.5 | 21.44 | 20.35 | 19.54 | 26.48 | 12.08 | 31.11 |
| variance of $\%$ gap chars | 68.4 | 79.4 | 90.7 | 65.2 | 74.6 | 56.8 | 74.9 |
| total tree length | | | | 763.6 | | | |
| minimum tree height | | | | 31.70 | | | |
| maximum tree height | | | | 77.80 | | | |
| average tree height | | | | 41.36 | | | |
| average pairwise distance | | | | 72.60 | | | |

 Table 3: Key statistics for datasets of additional experiments (bacteria tree)



Supplementary Figure 1: Equal duplication and loss rates. Relationship between the proportion of non-1-to-1 orthology and precision/recall for BBH (in red) on simulated datasets with different proportions of genes with a history of duplications. Loss rates were equal to duplication rates. Results for Inparanoid (green) and OMA/GETHOGs (blue) are given for comparison. Each point corresponds to the mean value of five replicates. Error bars give the 95% confidence interval of the mean values in both dimensions.



Supplementary Figure 2: Varying relative loss rates. Relationship between the proportion of non-1-to-1 orthology and precision/recall for BBH (in red) on simulated datasets with different proportions of genes with a history of duplications. Datasets with 10% duplications had a loss rate that was three times the duplication rate. For the datasets with 30% duplications, loss rate was either a third of or three times the duplication rate. For datasets with 40% duplications, loss rate was set to 0. Results for Inparanoid (green) and OMA/GETHOGs (blue) are given for comparison. Each point corresponds to the mean value of five replicates. Error bars give the 95% confidence interval of the mean values in both dimensions.

Additional experiments on simulated data (mammalia-like tree)



Supplementary Figure 3: Constant loss rates. Relationship between the proportion of non-1-to-1 orthology and precision/recall for BBH (in red) on simulated datasets with different proportions of genes with a history of duplications. Loss rate for all datasets was equal to the duplication rate of datasets with 10% duplication. Results for Inparanoid (green) and OMA/GETHOGs (blue) are given for comparison. Each point corresponds to the mean value of five replicates. Error bars give the 95% confidence interval of the mean values in both dimensions.



Supplementary Figure 4: Equal duplication and loss rates. Relationship between the proportion of non-1-to-1 orthology and precision/recall for BBH (in red) on simulated datasets with different proportions of genes with a history of duplications. Loss rates were equal to duplication rates. Results for Inparanoid (green) and OMA/GETHOGs (blue) are given for comparison. Each point corresponds to the mean value of five replicates. Error bars give the 95% confidence interval of the mean values in both dimensions.

| | | | | | | vupu v | lcation | S | | | | |
|-----------------------------|-------|--------|----------|-----------------|--------|-----------|----------------|--------|--------|-----------|---------|-----------------|
| | | cons | st. loss | \mathbf{rate} | | edn | al loss | rate | varyiı | ng relati | ve loss | \mathbf{rate} |
| | 0 | 10 | 20 | 30 | 40 | 20 | 30 | 40 | 10 | 30 | 30 | 40 |
| parameters values | | | | | | | | | | | | |
| # of sequences | | | | | | 10 | 00 | | | | | |
| distr. of seq. length | | | | | Γ | k = 1.8, | $\theta = 274$ | .1) | | | | |
| min. sequence length | | | | | | ъ | 0 | | | | | |
| substitution model | | | | | | M_2 | AG | | | | | |
| insertion and deletion rate | | | | | | 0.00 | 0125 | | | | | |
| gene duplication rate | 0 | 0.0065 | 0.013 | 0.0205 | 0.0295 | 0.013 | 0.025 | 0.0455 | 0.0065 | 0.0201 | 0.021 | 0.03 |
| gene loss rate | 0 | | 0.0 | 365 | | 0.013 | 0.025 | 0.045 | 0.0195 | 0.0067 | 0.063 | 0 |
| # of species | | | | | | 2 | 0 | | | | | |
| key statistics | | | | | | | | | | | | |
| seq. length - mean | 487.6 | 485.8 | 483.0 | 487.6 | 482.8 | 488.6 | 488.1 | 495.5 | 483.9 | 483.9 | 484.2 | 481.1 |
| seq. length - stderr | 363.2 | 363.0 | 363.6 | 373.1 | 350.9 | 367.9 | 362.5 | 369.5 | 358.5 | 364.4 | 365.5 | 356.8 |
| avg. % gap chars in MSA | 4.0 | 3.87 | 4.27 | 4.74 | 5.29 | 3.8 | 3.86 | 3.75 | 3.26 | 4.72 | 2.35 | 5.89 |
| variance of $\%$ gap chars | 12.6 | 13.4 | 15.2 | 18.6 | 21.9 | 15.1 | 16.4 | 18.6 | 12.0 | 18.7 | 9.7 | 23.2 |
| total tree length | | | | | | 10 | 1.2 | | | | | |
| minimum tree height | | | | | | 14 | .70 | | | | | |
| maximum tree height | | | | | | 19 | .18 | | | | | |
| average tree height | | | | | | 17 | .48 | | | | | |
| average pairwise distance | | | | | | 14 | .50 | | | | | |

 Table 4: Key statistics for datasets of additional experiments (mammalia-like tree)



Supplementary Figure 5: Varying relative loss rates. Relationship between the proportion of non-1-to-1 orthology and precision/recall for BBH (in red) on simulated datasets with different proportions of genes with a history of duplications. Datasets with 10% duplications had a loss rate that was three times the duplication rate. For the datasets with 30% duplications, loss rate was either a third of or three times the duplication rate. For datasets with 40% duplications, loss rate was set to 0. Results for Inparanoid (green) and OMA/GETHOGs (blue) are given for comparison. Each point corresponds to the mean value of five replicates. Error bars give the 95% confidence interval of the mean values in both dimensions.



Supplementary Figure 6: Testing the intersection/union-bound approach on simulated data Precision and recall of BBH on simulated biological datasets, estimated from the intersection and union sets of orthologs inferred by Inparanoid and GETHOGs—the intersection yielding a lower bound and the union yielding an upper bound for precision and recall. Visually, the estimated trendlines (thick lines) coincide well with the true trendlines (slim solid lines).



Supplementary Figure 7: Suitability of BBH to identify ortholog seeds (simulation). Proportion of orthologous groups—defined here as sets of n:m orthologs—for which at least one pair is predicted by BBH (red), as a function of the proportion of non-1-to-1 orthologs. Analysis on simulated datasets, with different proportions of genes with a history of duplications. Loss rate for all datasets was equal to the duplication rate of datasets with 10% duplication. Results for Inparanoid (green) and OMA/GETHOGs (blue) are given for comparison.



Supplementary Figure 8: Suitability of BBH to identify ortholog seeds (real data). Proportion of orthologous groups—defined here as sets of n:m orthologs—for which at least one pair is predicted by BBH, as a function of the proportion of non-1-to-1 orthologs. Analysis on real biological datasets, estimated from the intersection and union sets of orthologs inferred by Inparanoid and GETHOGs.

List of Species

| species | # of sequences |
|--|----------------|
| Aciduliprofundum boonei (strain DSM 19572) | 1539 |
| Aeropyrum pernix (strain ATCC 700893) | 1699 |
| Ferroglobus placidus (strain DSM 10642) | 2463 |
| Haloferax volcanii (strain ATCC 29605) | 3986 |
| Ignisphaera aggregans (strain DSM 17230) | 1929 |
| Ignicoccus hospitalis (strain KIN4/I) | 1434 |
| Korarchaeum cryptofilum (strain OPF8) | 1602 |
| Methanosarcina acetivorans (strain ATCC 35395) | 4463 |
| Methanopyrus kandleri (strain AV19) | 1690 |
| Methanococcus maripaludis | 1849 |
| Methanoplanus petrolearius (strain DSM 11571) | 2779 |
| Methanothermobacter marburgensis (strain DSM 2133) | 1755 |
| Nanoarchaeum equitans (strain Kin4-M) | 536 |
| Nitrosopumilus maritimus (strain SCM1) | 1795 |
| Picrophilus torridus (strain ATCC 700027) | 1535 |
| Pyrococcus furiosus (strain ATCC 43587) | 2052 |
| Staphylothermus marinus (strain ATCC 43588) | 1570 |
| Sulfolobus islandicus (strain M.16.4) | 2729 |
| Thermofilum pendens (strain Hrk 5) | 1876 |
| Vulcanisaeta distributa (strain DSM 14429) | 2492 |

Supplementary Table 1: List of species in archaea dataset.

| species | # of sequences |
|---|----------------|
| Alicyclobacillus acidocaldarius subsp. acidocaldarius (strain ATCC 27009) | 3059 |
| Alkaliphilus metalliredigens (strain QYMF) | 4463 |
| Anaerococcus prevotii (strain ATCC 9321) | 1795 |
| Caldicellulosiruptor saccharolyticus (strain ATCC 43494) | 2619 |
| Clostridium beijerinckii (strain ATCC 51743) | 5003 |
| Clostridium cellulolyticum (strain ATCC 35319) | 3286 |
| Clostridium phytofermentans (strain ATCC 700394) | 3889 |
| Coprothermobacter proteolyticus (strain ATCC 35245) | 1481 |
| Desulfitobacterium hafniense (strain Y51) | 5015 |
| Desulfotomaculum reducens (strain MI-1) | 3214 |
| Finegoldia magna (strain ATCC 29328) | 1813 |
| Geobacillus sp. (strain Y412MC10) | 6237 |
| Halothermothrix orenii (strain H 168) | 2324 |
| Lactobacillus acidophilus (strain ATCC 700396) | 1860 |
| Leuconostoc mesenteroides subsp. mesenteroides (strain ATCC 8293) | 2002 |
| Moorella thermoacetica (strain ATCC 39073) | 2450 |
| Natranaerobius thermophilus (strain ATCC BAA-1301) | 2836 |
| Symbiobacterium thermophilum (strain T) | 3312 |
| Syntrophomonas wolfei subsp. wolfei (strain Goettingen) | 2471 |
| Thermoanaerobacter sp. (strain X514) | 2322 |

Supplementary Table 2: List of species in firmicutes dataset.

| species | # of sequences |
|---|----------------|
| Agaricus bisporus | 10366 |
| Ashbya gossypii (strain ATCC 10895) | 4707 |
| Neosartorya fumigata (strain ATCC MYA-4609) | 9832 |
| Botryotinia fuckeliana (strain B05.10) | 16299 |
| Candida albicans (strain WO-1) | 5695 |
| Candida glabrata (strain ATCC 2001) | 4752 |
| Cryptococcus neoformans | 6231 |
| Debaryomyces hansenii (strain ATCC 36239) | 6263 |
| Emericella nidulans (strain FGSC A4) | 10510 |
| Encephalitozoon cuniculi (strain GB-M1) | 1895 |
| Kluyveromyces lactis (strain ATCC 8585) | 5230 |
| Laccaria bicolor | 20052 |
| Lodderomyces elongisporus (strain ATCC 11503) | 5772 |
| Magnaporthe grisea | 12637 |
| Mycosphaerella graminicola | 10932 |
| Neurospora crassa (strain ATCC 24698) | 7569 |
| Phaeosphaeria nodorum (strain SN15) | 16489 |
| Scheffersomyces stipitis (strain ATCC 58785) | 5799 |
| Puccinia graminis f. sp. tritici (strain CRL 75-36-700-3) | 20364 |
| Schizosaccharomyces pombe (strain 972) | 4958 |
| Ustilago maydis (strain 521) | 6510 |
| Yarrowia lipolytica (strain CLIB 122) | 6603 |
| Saccharomyces cerevisiae (strain ATCC 204508) | 6328 |
| | |

Supplementary Table 3: List of species in fungi dataset.

| species | # of sequences |
|---|----------------|
| Acinetobacter baumannii (strain AYE) | 3715 |
| Acidithiobacillus ferrooxidans (strain ATCC 23270) | 3119 |
| Alcanivorax borkumensis (strain SK2) | 2752 |
| Baumannia cicadellinicola subsp. Homalodisca coagulata | 595 |
| Buchnera aphidicola subsp. Acyrthosiphon pisum (strain APS) | 571 |
| Buchnera aphidicola subsp. Baizongia pistaciae (strain Bp) | 507 |
| Buchnera aphidicola subsp. Cinara cedri (strain Cc) | 365 |
| Carsonella ruddii (strain PV) | 182 |
| Coxiella burnetii (strain Dugway 5J108-111) | 2110 |
| Dichelobacter nodosus (strain VCS1703A) | 1273 |
| Francisella tularensis subsp. novicida (strain U112) | 1719 |
| Legionella pneumophila (strain Paris) | 3059 |
| Marinomonas sp. (strain MWYL1) | 4415 |
| Pseudomonas aeruginosa (strain UCBPP-PA14) | 5886 |
| Ruthia magnifica subsp. Calyptogena magnifica | 976 |
| Shewanella baltica (strain OS195) | 4616 |
| Thiomicrospira crunogena (strain XCL-2) | 2183 |
| Thioalkalivibrio sp. (strain HL-EbGR7) | 3272 |
| Wigglesworthia glossinidia brevipalpis | 612 |
| Xanthomonas campestris pv. campestris (strain ATCC 33913) | 4123 |

Supplementary Table 4: List of species in Gammaproteobacteria dataset.

| species | # of sequences |
|-----------------------------------|----------------|
| Acyrthosiphon pisum | 33992 |
| Aedes aegypti | 15129 |
| Apis mellifera | 10378 |
| Bombyx mori | 14577 |
| Branchiostoma floridae | 28464 |
| Caenorhabditis remanei | 31096 |
| Capitella sp. 1 | 31562 |
| Ciona intestinalis | 15464 |
| Daphnia pulex | 30088 |
| Drosophila virilis | 14351 |
| Gasterosteus aculeatus | 21832 |
| Helobdella robusta | 23263 |
| Ixodes scapularis | 20454 |
| Lottia gigantea | 23514 |
| Nematostella vectensis | 26036 |
| Pediculus humanus subsp. corporis | 10733 |
| Pristionchus pacificus | 29363 |
| Schistosoma mansoni | 11404 |
| Strongylocentrotus purpuratus | 26882 |
| Trichoplax adhaerens | 11466 |

 ${\bf Supplementary \ Table \ 5:} \ {\rm List \ of \ species \ in \ Metazoa \ dataset}.$

| species | # of sequences |
|---|----------------|
| Arabidopsis lyrata | 32085 |
| Arabidopsis thaliana | 27489 |
| Chlamydomonas reinhardtii | 16900 |
| Hordeum vulgare var. distichum | 29214 |
| Zea mays | 107258 |
| Manihot esculenta | 32737 |
| Oryza sativa subsp. japonica | 58246 |
| Ostreococcus lucimarinus (strain CCE9901) | 7410 |
| Ostreococcus tauri | 7860 |
| Populus trichocarpa | 41297 |
| Sorghum bicolor | 35447 |
| Vitis vinifera | 26207 |
| | |

Supplementary Table 6: List of species in Viridiplantae dataset.