

# PhyloNet

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# Installation

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- ✿ System requirement:  
Java 1.8 or later
- ✿ Download executable of PhyloNet (latest version 3.6.0):  
<http://bioinfo.cs.rice.edu/PhyloNet>

# Basic Usage

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- \* Command:

```
>java -jar PhyloNet_3.6.0.jar script.nex
```

- \* Input NEXUS file:

```
#NEXUS

BEGIN TREES;

Tree g1 = (((a,b),c),d),e);
Tree g2 = ((a,b),((c,e),d));
Tree g3 = ((a,c),((b,e),d));

END;

BEGIN PHYLONET;

Infer_ST_MDC (g1, g2, g3);

END;
```

# Estimating species phylogenies from gene trees

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- ❖ Maximum Likelihood: *InferNetwork\_ML*
- ❖ Maximum Pseudo-Likelihood: *InferNetwork\_MPL*
- ❖ Bayesian: *MCMC\_GT*
- ❖ Maximum Parsimony:
  - ❖ Trees: *Infer\_ST\_MDC*, *Infer\_ST\_MDC\_UR*
  - ❖ Networks: *InferNetwork\_MP*

ILS

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# Maximum Parsimony

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## ❖ Command Usage

```
infer_ST_MDC/infer_ST_MDC_UR (geneTree1 [, geneTree2...])  
[-e proportion] [-x] [-b threshold] [-a taxaMap] [-ur] [-t time] [resultOutputFile]
```

<i>geneTree1 [, geneTree2...]</i>	Comma delimited collection of gene trees.	mandatory
<i>-a taxaMap</i>	Gene trees / species tree taxa association.	optional
<i>-b threshold</i>	Gene trees bootstrap threshold.	optional
<i>-e proportion</i>	Get optimal and sub-optimal species trees whose scores are less than <i>proportion</i> % worse than the optimal score.	optional
<i>-x</i>	Use all clusters instead of clusters in gene trees.	optional
<i>-ur</i>	Allow returning unresolved species tree.	optional
<i>-t timeLimit</i>	Limit search time to <i>timeLimit</i> minutes.	optional
<i>resultOutputFile</i>	Optional file destination for command output.	optional

# Maximum Parsimony

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## \* Input NEXUS File

```
#NEXUS

BEGIN TREES;
Tree gt0 = ((((((Scer,Spar),Smik),Skud),Sbay),Scas),Sklu),Calb);
...
Tree gt105 = ((((((Scer,Spar),Smik),Skud),Sbay),(Scas,Sklu)),Calb);
END;

BEGIN PHYLONET;
Infer_ST_MDC (gt0-gt105);
END;
```

## \* Output

```
(Calb:0,(Sklu:0,(Scas:0,(Sbay:0,(Skud:0,(Smik:0,(Scer:0,Spar:0):2):21):54):0):35):0):0;
Total number of extra lineages:112
```

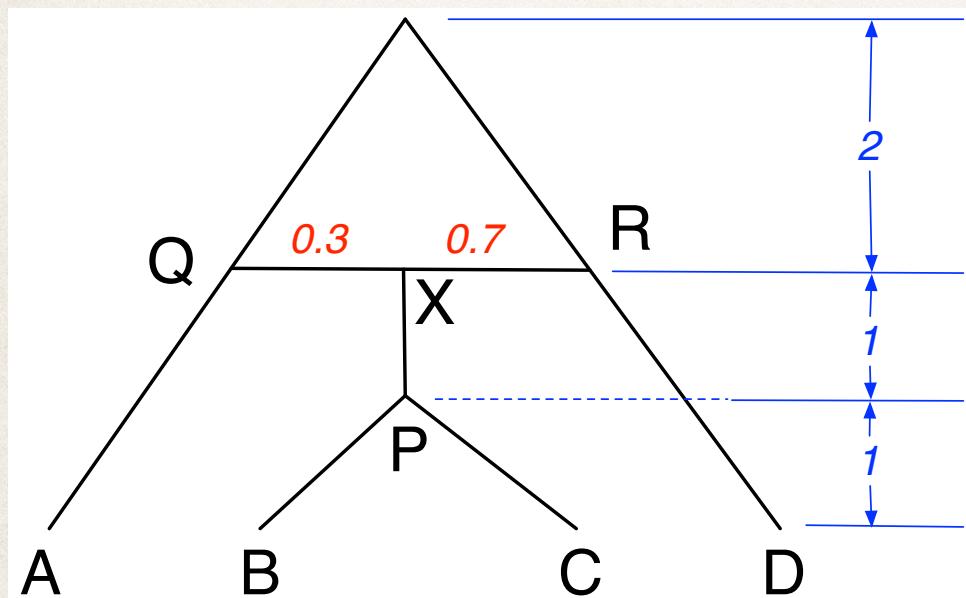
# ILS + Introgression

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# Phylogenetic Network

- Rich Newick Format

- Newick for phylogenetic tree & Extended Newick for phylogenetic network (Cardona et al., 2008)



[e/display/PHYLONET/Rich](#)

((A:2,((B:1,C:1)P:1)X#H1:0::0.3)Q:2,  
(D:2,X#H1:0::0.7)R:2);

:branch length:support:inheritance probability

# ILS + Introgression

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## Parsimony

# Maximum Parsimony

## ❖ Command Usage

```
InferNetwork_MP (geneTree1 [, geneTree2...]) numReticulations [-a taxa  
map] [-b threshold] [-s startingNetwork] [-n numNetReturned] [-m  
maxNetExamined] [-d maxDiameter] [-h {s1 [,s2...]}] [-w (w1,w2,w3,w4)] [-f  
maxFailure] [-x numRuns] [-pl numProcessors] [-di] [result output file]
```

<i>geneTree1 [, geneTree2...]</i>	Comma delimited collection of gene trees.	mandatory
<i>numReticulations</i>	Maximum number of reticulation nodes to added.	mandatory
<i>-s startingNetwork</i>	Specify the network to start search. Default value is the optimal MDC tree.	optional
<i>-n numNetReturned</i>	Number of optimal networks to return. Default value is 1.	optional
<i>-h {s1 [, s2...]}</i>	A set of specified hybrid species. The size of this set equals the number of reticulations in the inferred network	optional
<i>-pl numProcessors</i>	Number of processors if you want the computation to be done in parallel. Default value is 1.	optional
<i>-di</i>	Output the Rich Newick string of the inferred network that can be read by Dendroscope.	optional

See [https://wiki.rice.edu/confluence/display/PHYLONET/InferNetwork\\_MP](https://wiki.rice.edu/confluence/display/PHYLONET/InferNetwork_MP) for details.

# Maximum Parsimony

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## ❖ Input NEXUS File

```
#NEXUS

BEGIN TREES;
Tree gt0 = ((((((Scer,Spar),Smik),Skud),Sbay),Scas),Sklu),Calb);
...
Tree gt105 = (((((Scer,Spar),Smik),Skud),Sbay),(Scas,Sklu)),Calb);
END;

BEGIN PHYLONET;
InferNetwork_MP (gt0-gt105) 1;
END;
```

## ❖ Output

```
(((((Sbay)#H1:::0.3608,Skud),((Spar,Scer),Smik)), #H1:::0.6392),Scas),Sklu),Calb);
Total number of extra lineages: 60
```

# ILS + Introgression

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## Likelihood

# Maximum Likelihood

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## \* Command Usage

```
InferNetwork_ML (geneTree1 [, geneTree2...])  
numReticulations [-a taxa map] [-bl] [-b threshold] [-s  
startingNetwork] [-n numNetReturned] [-h {s1 [,s2...]}] [-w  
(w1,w2,w3,w4)] [-x numRuns] [-m maxNetExamined] [-md  
moveDiameter] [-rd reticulationDiameter] [-f maxFailure] [-  
o] [-po] [-p (rel,abs)] [-r maxRounds] [-t maxTryPerBr] [-i  
improveThreshold] [-l maxBL] [-pl numProcessors] [-di]  
[result output file]
```

-po	Branch lengths are sampled during the search. This option allows users to optimize branch lengths and inheritance probabilities of the inferred networks as a post-process	optional
-bl	The branch lengths of the input gene trees need to be considered in the computation.	

See [https://wiki.rice.edu/confluence/display/PHYLONET/InferNetwork\\_ML+Command](https://wiki.rice.edu/confluence/display/PHYLONET/InferNetwork_ML+Command) for details.

# Maximum Likelihood

---

## ❖ Input NEXUS File

```
#NEXUS

BEGIN TREES;
Tree gt0 = (((Scer,Spar),Smik),Skud),Sbay);
...
Tree gt105 = ((Scer,Spar),Smik,Skud,Sbay);
END;

BEGIN PHYLONET;
InferNetwork_ML (gt0-gt105) 1;
END;
```

## ❖ Output

```
Inferred Network #1:
((Sbay:1.0)#H1:1.0::0.6130,((Smik:1.0,(Scer:1.0,Spar:1.0):3.5436):1.0585,
(#H1:1.0::0.3869,Skud:1.0):2.1717):5.9272);
Total log probability: -151.57753843275103
```

# ILS + Introgression

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## Pseudo-Likelihood

# Maximum Pseudo-Likelihood

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## ❖ Command Usage

```
InferNetwork_MPL (geneTree1 [, geneTree2...])  
numReticulations [-a taxa map] [-b threshold] [-s  
startingNetwork] [-n numNetReturned] [-h {s1 [,s2...]}]  
[-w (w1,w2,w3,w4)] [-x numRuns] [-m maxNetExamined] [-md  
moveDiameter] [-rd reticulationDiameter] [-f maxFailure]  
[-o] [-po] [-p (rel,abs)] [-r maxRounds] [-t maxTryPerBr]  
[-i improveThreshold] [-l maxBL] [-pl numProcessors] [-  
di] [result output file]
```

-po	Branch lengths are sampled during the search. This option allows users to optimize branch lengths and inheritance probabilities of the inferred networks under FULL likelihood as a post-process	optional
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# Maximum Pseudo-Likelihood

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## \* Input NEXUS File

```
#NEXUS

BEGIN TREES;
Tree gt0 = (((Scer,Spar),Smik),Skud),Sbay);
...
Tree gt105 = ((Scer,Spar),Smik,Skud,Sbay);
END;

BEGIN PHYLONET;
InferNetwork_MPL (gt0-gt105) 1 -x 10 -po;
END;
```

# Maximum Pseudo-Likelihood

## \* Output

Inferred Network #1:

```
((Sbay:1.0)#H1:1.0:::0.6130,((Smik:1.0,(Scer:1.0,Spar:1.0):3.5436):1.0585,  
(#H1:1.0:::0.3869,Skud:1.0):2.1717):5.9272);
```

Total log probability: -151.57753843275103

Inferred Network #2:

```
((((Smik:1.0,(Scer:1.0,Spar:1.0):3.5517):0.8718)#H1:1.5844::0.6690,Skud:1.0):1.6469,Sbay:  
1.0):5.914823983639853,#H1:0.0012::0.3309);
```

Total log probability: -168.28650850921707

Inferred Network #3:

```
((Smik:1.0,(Scer:1.0,Spar:1.0):3.5379):1.0444,(Skud:1.0)#H1:1.0:::0.7007):0.8788,  
(#H1:1.0:::0.2993,Sbay:1.0):5.9324);
```

Total log probability: -177.6791272776054

Inferred Network #4:

```
((Sbay:1.0,(Skud:1.0)#H1:1.0:::0.9288):0.2035,((#H1:1.0:::0.0712,Smik:1.0):0.0012,(Spar:  
1.0,Scer:1.0):3.5535):1.3471);
```

Total log probability: -199.98142731241273

Inferred Network #5:

```
((Skud:1.0)#H1:1.0:::0.9326,Sbay:1.0):0.1974,((#H1:1.0:::0.0674,(Spar:1.0,Scer:1.0):3.5517):  
0.0012,Smik:1.0):1.3412);
```

Total log probability: -199.98564708955553

# ILS + Introgression

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## Bayesian

# Bayesian

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## \* Command Usage

```
MCMC_GT (geneTree1 [, geneTree2...]) [-cl chainLength]
[-bl burnInLength] [-sf sampleFrequency] [-sd seed] [-pp
poissonParameter] [-mr maximumReticulation] [-pl
parallelThreads] [-tp temperatureList] [-sn
startingNetworkList] [-tm taxonMap]
```

-mr	The maximum number of reticulation nodes in the sampled phylogenetic networks. The default value is infinity.	optional
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See [https://wiki.rice.edu/confluence/display/PHYLONET/MCMC\\_GT+Command](https://wiki.rice.edu/confluence/display/PHYLONET/MCMC_GT+Command) for details.

# Bayesian

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- ❖ Input NEXUS File

```
#NEXUS

BEGIN TREES;
Tree gt0 = (((Scer,Spar),Smik),Skud),Sbay);
...
Tree gt105 = ((Scer,Spar),Smik,Skud,Sbay);
END;

BEGIN PHYLONET;
MCMC_GT (gt0-gt105);
END;
```

# Bayesian

---

## \* Output

```
Iteration; Posterior; ESS; Likelihood; Prior; ESS; #Reticulation
0; -252.23994; 0.00000; -244.23994; -8.00000; 0.00000; 0;
(Sbay:1.0,(Skud:1.0,(Smik:1.0,(Scer:1.0,Spar:1.0):1.0):1.0):1.0);
.....
1100; -182.48421; 6.31204; -154.15857; -28.32565; 8.02957; 1;
((Sbay:0.8364)I0#H1:0.5373::0.5949,((Smik:1.0,(Scer:1.0,Spar:1.0)I5:3.3052)I4:0.8173,(Skud:
2.7098,I0#H1:0.6856::0.4051)I2:2.9664)I3:2.2888)I1;

----- Summarization: -----
Burn-in = 100000, Chain length = 1100000, Sample size = 1000 Acceptance rate = 0.55319

----- Operations -----
Operation:Move-Head; Used:143520; Accepted:1 ACrate:6.967670011148272E-6
.....
Operation:Delete-Reticulation; Used:5358; Accepted:2626 ACrate:0.49010824934677116

Overall MAP = -179.89656989770972
(((Sbay:0.8364)I0#H1:0.6856::0.3776,Skud:2.7098)I2:1.7771,(Smik:1.0,(Scer:1.0,Spar:
1.0)I5:2.9942)I4:1.0385)I3:2.4721,I0#H1:0.5373::0.6224)I1;
```

# Bayesian

## \* Output

```
----- Top Topologies: -----
Rank = 0; Size = 818; Percent = 0.818;
MAP = -179.89656989770972: (((Sbay:0.8364)I0#H1:0.6856::0.3776,Skud:2.7098)I2:1.7771,(Smik:1.0,(Scer:
1.0,Spar:1.0)I5:2.9942)I4:1.0385)I3:2.4721,I0#H1:0.5373::0.6224)I1;
Ave = -182.497829758399; ((Sbay:0.8364)I0#H1:0.5373::0.6231,((Spar:1.0,Scer:1.0)I5:3.3546,Smik:
1.0)I4:1.0773,(Skud:2.7098,I0#H1:0.6857::0.3769)I2:1.9924)I3:2.6931)I1;

Rank = 1; Size = 180; Percent = 0.18;
MAP = -191.61104349697848:((((((Spar:1.0,Scer:1.0)I5:3.3889,Smik:
1.0)I4:0.8307)I3#H1:0.9523::0.6741,Skud:0.1783)I2:1.2530,Sbay:0.3632)I0:1.6455,I3#H1:0.0210::0.3258)I1;
Ave = -194.12662772729175; (((Smik:1.0,(Scer:1.0,Spar:1.0)I5:3.3053)I4:0.9721)I3#H1:0.0479::0.3634,
(Sbay:0.3632,(Skud:0.1919,I3#H1:1.2856::0.6365)I2:1.4111)I0:1.5633)I1;

Rank = 2; Size = 2; Percent = 0.002;
MAP = -189.56637204871708:((((Skud:2.7098,(Sbay:
0.8363)I0#H2:0.6856::0.3355)I2:3.8612)I6#H1:0.0667::0.3223,((Spar:1.0,Scer:1.0)I5:2.6678,Smik:
1.0)I4:0.4006)I7:1.0679,I6#H1:0.2275::0.6776)I3:2.1196,I0#H2:0.5372::0.6644)I1;
Ave = -190.47255907248774; ((Sbay:0.8363)I0#H1:0.5372::0.8354,((I0#H1:0.6856::0.1645,Skud:
2.7098)I2:3.7692)I6#H2:0.2659::0.7540,((Smik:1.0,(Scer:1.0,Spar:
1.0)I5:2.4576)I4:0.4274,I6#H2:0.0704::0.2459)I7:1.2316)I3:2.0443)I1;
```

# Scalability

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- ❖ Maximum Parsimony:  
~30 taxa, 3 or 4 reticulations
- ❖ Maximum Likelihood:  
~10 taxa, 2 or 3 reticulations
- ❖ Maximum Pseudo-Likelihood:  
~30 taxa
- ❖ Bayesian:  
~10 taxa, 2 or 3 reticulations

# Testing Your Hypothesis

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- \* Parsimony:
  - \* Trees: *DeepCoalCount\_tree*
  - \* Networks: *DeepCoalCount\_network*
- \* Likelihood: *CalGTProb*

# Relevant Publications

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- Likelihood: Yu et. al, *PloS Genetics*, vol. 8, no. 4, p. e1002660, 2012
- Parsimony: Yu et. al, *Systematic Biology*, vol. 62, no. 5, pp. 738-751, 2013
- Likelihood: Yu et. al, *PNAS*, vol. 111, no. 46, pp. 16448-16453, 2014
- Pseudo-likelihood: Yu et. al, *BMC Genomics*, vol. 16, no. Suppl 10, p. S10, 2015
- Application: Wen et. al, *Molecular Ecology*, vol. 25, pp. 2361-2372, 2016
- Bayesian: Wen et. al, *PloS Genetics*, vol. 12, no. 5, p. e1006006, 2016

Try it yourself!