### Assessment of biases using distinct metabarcoding technologies for sequencing of fungal ITS amplicons

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## Why optimization of current protocols?





- > Most biases occurring during PCR well known. What about sequencing biases?
- > Quantify the relative importance of biases (e.g. sequencing, PCR) and correct/account for such biases

Some studies suggest that HTS data should not be analyzed as relative proportions but as binary data instead.... Also suggested by several reviewers

Scientific community is sometimes aware of some/most of the biases, but still several protocols are not optimized to minimize the risk of biases

May affect our results... and ecological interpretations?

### Still several protocols are not optimized to minimize the risk of biases SLU

ately 250 bp) of the nuclear ribosomal rDNA repeat, using the following The pre cycle of 95°C for 5 min; then 37 cycles of 95°C for 20 s, 56°C for 30 s and llowed by a final elongation of 10 min at 72°C. The composition of the The PCR master mix contained 17.1 µl molecular grade water, 1 µl 5 µM

primer, 0.5 µM of the gITS7 primer, and 1U of 1× Phusion High Fidelity DNA Polymerase (New England Biolabs). Thermocycling conditions were as follows: 98 °C for 30 s, 35 cycles of 98 °C for 10 s, 56 °C for 30 s, 72 °C for 15 s and a final extension at 72 °C for 7 min. Negative controls, 94 °C for 3 min, 35 cycles of 94 °C for 45 s, 50 °C for 1 min, 72 °C ior 1.5 primer and 10 ng of the sample DNA. The thermal

Polymerase: DyNAZyme II DNA polymerase, 1:24) and 1 5 min; 35 cycles of 0:10 min 0 c for 10 min 0 c for 2 for 10 min 0 c for 2 for 10 min 0 c for 2 for 30 s, extension at 72 °C for 30 s, extension at 72 °C for 60 s of denaturation at 95 °C for 30 s, extension at 72 °C for 60 s No c model of the formal extension at 72 °C for 10 min As negative control, water was used in the formal extension at 72 °C for 10 min 0 c for 10 min 0 c formal extension at 72 °C formal exten <sup>conditions</sup> were 94 °C for 5 min; 35 cycles of 94 °C for 10 min for primers eub53002 of denaturation at 95 °C for 30 s, annealing at 53 °C for 30 s, extension at 72 °C for 00 s of denaturation at 72 °C for 10 min. As negative control, water was used instead of followed by a final extension at 72 °C for 10 min. As negative control, water was used instead of followed by a final extension at 72 °C for 30 s, extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, followed by a final extension at 72 °C for 30 s, follo

ending with one cycle of 72°C for 7 min. ITS is the universal DNA 250 bp) of the nuclear fiber of 95°C for ycle of 95°C for 5 min; then 37 cycles of 95°C for ycle of 95°C for 5 min; then 37 cycles of 95°C for noise and 95°C for 5 min; then 37 cycles of 95°C for noise and 95°C for 5 min; then 37 cycles of 95°C for noise and 95°C for 5 min; then 37 cycles of 95°C for noise and 95°C for 5 min; then 37 cycles of 95°C for noise and 95°C for 5 min; then 37 cycles of 95°C for noise and 95°C for 5 min; then 37 cycles of 95°C for noise and 95°C for 5 min; then 37 cycles of 95°C for noise and 95°C for 5 min; then 37 cycles of 95°C for noise and 95°C for 5 min; then 37 cycles of 95°C for noise and 95°C for 5 min; then 37 cycles of 95°C for noise and 95°C for 5 min; then 37 cycles of 95°C for noise and 95°C for 5 min; then 37 cycles of 95°C for noise and 95°C for 5 min; then 37 cycles of 95°C for noise and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological mers. (10 µM) and 0.0 4 µl Transfer for noise and for l was primer and 0.4 µl Taq polymerase (Invitrogen, 94 °C for 3 min, 35 cycles of 94 °C 101 49 , 94 °C for 3 min, 35 cycles of 94 °C 101 49 , 94 °C for 3 min, 35 cycles of 94 °C 101 49 , 94 °C for 3 min, 35 cycles of 94 °C 101 49 , 94 °C for 3 min, 35 cycles of 95 °C for 20 s, 94 °C for 3 min, 35 cycles of 95 °C for 20 s, 94 °C for 30 s and 72 °C for 1.5 min; and ending with one set ITSIf (Gardes and Bruns, 1993) and ITS2 (White et al., 1990), studied to react the prime 72 °C for 10 min The ITC2

### Still several protocols are not optimized to minimize the risk of biases SLU



#### Sometimes n° of cycles can be as much as 45...

Polymerase: DyNAZyme II DNA polymerase, 1:24) and 1 5 min; 35 cycles a Control of Contro 0.2 µl of 0.056 U fast StartExpTag Polymerase (Roche Applied Sciences, Indianapolis, IN, vcles followed by a final extension at 72 °C for 10 min. As negative control, water was used instead of

ately 250 bp) of the nuclear ribosomal rDNA repeat, using the following The one cycle of 95°C for 5 min; the 37 cycles of 95°C for 20 s, 56°C for 30 s and The PCR conditions were the following: 94°C for 5 min, followed b llowed by a final elongation of 10 min at 72°C. The composition of the The PCR master mix contained 17.1 µl molecular grade water, 1 µl 5 µM

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ending with one cycle of 72°C for 7 min. ITS is the universal DNA 250 bp) of the nuclear fibe 37 cycles of 95°C for the universal Diverse 250 bp) of the nuclear fibe 37 cycles of 95°C for 5 min; the 37 cycles of 95°C for 7 min. ITS is the universal Diverse of 95°C for 5 min; the 37 cycles of 95°C for 7 min. ITS is the universal Diverse and ecological ending with one cycle of 72°C for 7 min. ITS is the universal Diverse and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been used in a wide variety of taxonomic and ecological ingi and has been I was primer and to for a min 35 ycles of 94 °C 101 40 for and 102 °C. We used the prime. CA). We used the following PCR conditions: an initial 990, slightly and row of 94 °C 101 40 for a min final extension at 72 °C. We used the prime. CA). We used the following PCR conditions: an initial set for 3 min final extension at 72 °C. We used the prime. CA). We used the following PCR conditions: an initial set for 3 min final extension at 72 °C. We used the prime. CA). We used the following PCR conditions: an initial set for 3 min final extension at 72 °C. We used the prime. CA) we used the following PCR conditions: an initial set for 3 min final extension at 72 °C. We used the prime. CA) we used the following PCR conditions: an initial set for 3 min final extension at 72 °C. We used the prime of a for 5 °C for 20 s, for 10 min final extension at 72 °C for 10 min The row of the prime of t

### Protocol optimization: Primers, PCR conditions (...)

#### RESEARCH ARTICLE

New primers to amplify the fungal ITS2 region – evaluation by 454-sequencing of artificial and natural communities

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- Interspecific variation in fungal ITS length
- f(g)ITS7-ITS4 primers showed more or less even amplification of selected group of taxa! But still with some deviations from expected abundances
- Possibility to identify and predict these biases? (And correct for them?)
- Optimization of PCR conditions to minimize biases....

> ....and the use of the less-biased sequencing platform (MiSeq?, IonTorrent?, PacBio?)

# Objectives

 to study the effect of DNA sequencing on the community composition and assess associated sequencing biases

 to quantify and compare biases introduced by three sequencing platforms (Illumina MiSeq, PacBio RS II, PacBio Sequel)

• to assess combined PCR and HTS biases on the final community

 to elaborate a ready-to-use protocol that allows semi-quantitative analysis of fungal communities



- Excellent tool to assess biases
- Spike-in mock community (ITS MOCK, 10 fragments differing in size length and GC content)

- Fragments obtained from *H. annosum* genome
- Length: From 180 (min) to 630 bp (max)
- GC content: From 45% to 63%
- Primers fITS7-ITS4



...Fragments extracted from plasmids were combined using distinct assemblies to test the sequencing biases, for PCR and sequencing biases altogether and for PCR biases alone

### Experimental design





### Molecular works and bioinformatics



SCATA pipeline: http://scata.mykopat.slu.se



#### **Quality control**

#### PacBio & Illumina:

- Seq < 100 bp removed
- Screening of primers and tags
- Trimming of sequences with low quality

#### Alignments and sequence clustering

- Usearch (Edgar, 2011)
- Genotypes occurring only once in the global data removed
- Single linkage clustering (98.5% threshold)
- LULU post-clustering algorithm to merge daughter OTUs with parent OTUs (MiSeq)

#### **Molecular works**

- fITS7 and ITS4 primers (Ihrmark et al. 2012)
- Both primers tagged using previously validated tags
- Use of distinct PCR cycles
- Purification
- Equimolar mix
- Sequencing adaptor ligated

## Sequencing biases from evenly mixed fragments

- Sequencing biases largely determined by size length of the fragments, with MiSeq having the highest biases
- PacBio Sequel was the less biased platform



SLU	Sequencing and PCR biases from unevenly mixed fragments															Initial template						
	Communities sequenced with PacBio RSII (Sequel not tested here) resembled much more to the original community than Illumina MiSeq did																Relative		ons (%)			
	Deviation (%) from initial template																	0.04 0.45 4.48 44.78				
	-4(	) -20 0	20 40	Illumina MiSeq Fragment length (bas						s)												
142	189	243	295	344	395	447	499	548	591		142	189	243	295	344	395	447	499	548	591		
38.44	0.12	0.33	0.01	0.77	0.35	-0.08	-1.82	-2.09	-36.02	S1	55.12	0.06	-0.04	-0.04	-0.45	-0.45	-0.45	-4.48	-4.48	-44.78	S1	
-17.19	25.64	0.02	0.02	0	-0.05	-0.37	-0.26	-3.7	-4.12	S2	9.92	0.52	-0.04	-0.04	-0.04	-0.45	-0.45	-0.45	-4.48	-4.48	S2	
-2.51	7.71	0	-0.04	-0.02	-0.02	-0.35	-0.4	-0.43	-3.94	<b>S</b> 3	4.92	35.92	-34.88	-0.04	-0.04	-0.04	-0.45	-0.45	-0.45	-4.48	S3	
-1.82	1.75	13.02	-11.84	0.07	-0.04	0.01	-0.4	-0.45	-0.29	S4	23.32	19.42	-16.38	-24.98	-0.04	-0.04	-0.04	-0.45	-0.45	-0.45	S4	
-0.11	4.91	6.11	4.1	-14.27	0.02	-0.04	0.07	-0.39	-0.39	<b>S</b> 5	4.75	41.82	1.32	-8.78	-38.18	-0.04	-0.04	-0.04	-0.45	-0.45	<b>S</b> 5	
0.19	0.94	6.35	2.76	-5.58	-4.14	-0.04	-0.04	-0.04	-0.4	S6	15.85	12.85	11.32	8.02	-27.68	-19.88	-0.04	-0.04	-0.04	-0.45	S6	
-0.16	1.26	0.67	5.72	3.72	4.15	-15.27	0.01	-0.04	-0.04	S7	21.15	18.15	1.65	14.22	-0.68	-9.68	-44.68	-0.04	-0.04	-0.04	<b>S</b> 7	
0.07	2.6	1.38	1.32	7.43	2.89	-6.94	-8.66	-0.04	-0.04	<b>S</b> 8	6.16	57.45	6.15	4.55	7.02	7.62	-44.08	-44.78	-0.04	-0.04	<b>S</b> 8	
0.15	0.09	1.3	0.43	0.74	5.71	0.77	3.78	-12.9	-0.04	<b>S</b> 9	17.96	15.46	15.95	13.45	1.75	29.32	-4.38	-44.78	-44.78	-0.04	<b>S</b> 9	
0.06	0.83	0.44	2.94	1.78	1.88	6.08	1.24	11.52	-26.76	S10	34.26	25.36	3.76	25.45	5.15	4.55	-4.38	-4.48	-44.78	-44.78	S10	



- Communities sequenced with PacBio RSII (Sequel not tested here) resembled more to the original community than Illumina MiSeq did
- MiSeq data also showed high degree of stochasticity or non-explained variation





- PacBio Sequel seem to be the best and less biased platform, but be aware of low sequencing depth....
- Highest multivariate variance (beta diversity) in samples sequenced with PacBio, despite these resembled more to the initial composition (Before PCR and sequencing)



# PCR biases alone

- Increasing PCR cycles exacerbate size length biases, but GC content has no influence
- Shortest fragments are over-represented with more PCR cycles, and longest fragments are underrepresented



Modelling PCR cycles effect on % of each fragment across distinct lengths



#### Modelling PCR cycles effect on % of each fragment across distinct GC content

# SLU PCR biases alone

• Fragment size biases increased with increasing PCR cycles. Already obvious in BioAnalyzer

35 cycles

28 cycles

22 cycles



## PCR biases alone

- Final PCR product may be used to predict PCR biases, but overall, PCR cycles predict better biases than final PCR product
- Higher starting quantities allow the user to use less PCR cycles, but there was positive relationship between starting quantities and sequencing errors.

Relationship between PCR product and corrected slope (size length bias)







- (Semi)quantitative analysis of sequencing data is possible; also, possible to account for size length biases
- Length bias is largely the main factor determining total biases during sequencing and PCR
- PacBio Sequel is the sequencing platform that resembled more to the expected communities if biases would not occur
- Biases during PCR can be minimized using low PCR cycles; technically no biases occurring during PCR
- Non optimized PCR conditions exacerbate biases (size length biases, community distortion and errors), but the choice of the sequencing platform is more important to minimize biases
- Low sequencing output may result in stochastic results promoting community dispersion in ecologically similar samples. However, high sequencing depth in Illumina platforms do not alleviate biases
- The message is the need to improve current technologies





#### Methods

Optimized metabarcoding with Pacific biosciences enables semi-quantitative analysis of fungal communities

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