## Ultra deep targeted sequencing approaches

March 28th 2022, Aarhus, Denmark

Mads Heilskov Rasmussen, PhD Emil Christensen, PhD

## Agenda

- Target enrichment
- Why use ultra deep targeted sequencing?
- Target enrichment design
- Introduction to ultra deep target enrichment technologies
- Sources of noise in NGS
- Unique molecular identifiers
- Examples of ultra deep target enrichment technologies
- Cases

#### Target enrichment



## Why do we do ultra deep targeted sequencing?

#### • Consider a blood sample

- Limited amount of ctDNA
- Maximize the chance of finding ctDNA
- Exhaustive assessment of regions of interest
- Relatively low sequencing costs



Zviran et al., Nature Medicine, 2020

#### What's the catch?

- What if the enrichment is not optimal?
  - Tumor heterogeneity
  - Tumor evolution
- New critical mutations may arise
- What if no ctDNA fragments originating from the regions of interest are present?



#### Meeks et al., Nature Reviews Urology, 2020

#### Enrichment design

- Tumor agnostic
- Tumor informed
  - Non-personalized





Cohen et al., Science, 2018

#### **Enrichment design**

- Feasibility of tumor agnostic or tumor informed non-personalized approaches?
- Tumor informed and personalized



- Time ①
- Effort ①
- Consistency and reproducibility?
- Retrospective/prospective analysis setup

# Development of novel ultra deep NGS technologies ... and their methods



## Sources of errors in NGS that influence ctDNA detection



- 1. PCR errors
- 2. PCR "errors" on abasic nucleotides (sample storage and handling)
  - a. Oxidation of guanine G:C (-> 8-oxo-G:C) -> T:A mutations
  - b. Deamination of cytosine: C:G (-> U:G) -> T:A
  - c. Others
- 3. Image acquisition and interpretation (sequenator)
- 4. Biological noise: mutational signal from non-cancerous cells (e.g. "clonal hematopoietic expansion of unknown potential" = CHIP)

False positive signal is a critical limitation for ultra-sensitive ctDNA detection methods -> solution (1., 2. and 3.): UMI technology

#### How UMI mediated noise reduction works

UMI: Unique Molecular Identifier, a molecular **BARCODE** 



#### How UMI mediated noise reduction works



Reference:	AGTCAGTTCGCTG	
PCR duplicates:	AGTCAGTGCGCAG AGTCAGTTCGCAG AGTCCGTTCGCAG AGTCAGTTCGCAG AGTCAGTTTCAG AGTCAGTTCGCAG AGTCAGTTCGCAG	<b>UMI family</b> (same UMI + genomic pos)
Consensus read:	AGTCAGTTCGC <b>A</b> G	
	Ļ	
Calls:	T>A	

## Principal workflow of UMI mediated noise reduction

1. 2.	Library prep Target enrichment	
3.	Redundant sequencing	In lab

- 4. Mapping of raw fastq reads
- 5. Grouping of reads sharing UMI barcode and genomic position into "families"
- 6. Consensus sequence generation within UMI families
- 7. Mapping of consensus reads
- 8. Variant calling

On computer

#### Technology performances

Analytic performances of ultra deep targeted sequencing technologies (estimated)



#### **Duplex sequencing**



#### **Proximity sequencing**



## Case I: can ctDNA improve the post-OP treatment of CRC ?



Clinicians need a postOP response - ctDNA positive or negative ?

#### Case I: can ctDNA improve the post-OP treatment of CRC ?



#### Case I: can ctDNA improve the post-OP treatment of CRC ?

#### Why is it not perfect ?

- Low shedding (T1 tumors)
- cfDNA -> NGS efficiency
- ctDNA sampling effects
- Mean LOD 0.032 % (plasma)





#### **PreOP detection rates**

#### Case II



Genome coverage

No response to be given to clinicians - proof of principle

## Case II



Ultra deep sequencing with UMIs

## Case II

- Exploit cross patient data
- Single mutation calling
  - Shearwater algorithm<sup>1,2</sup>
    - Test vs. error model based on "normal samples"
- Sample level calling
  - Fisher's method for target mutations
  - Bootstrapping of random non-target mutations
    Fisher's method
  - Rank target mutation score in relation to non-target scores

#### Sample-wise test



<sup>1</sup> Gerstung et al., Bioinformatics, 2014

<sup>2</sup> Martincorena et al., Science, 2015

#### Key points: Ultra deep targeted sequencing

- Very high mean depth on relatively narrow genomic space
- The clinical situation and practical matters are important for the enrichment design
- False positive signals arise from 1) NGS image interpretation, and 2) PCR base misincorporation (especially on abasic bases)
- UMI directed strategies might be necessary to achieve sufficient sensitivity (for most clinical settings) due to false positive signal inherent to NGS

#### Selected references

NGS noise: Pfeiffer et al Sci Rep. 2018 Jul 19;8(1):10950

NGS specs: Loman et al Nat Biotechnol. 2012;30(5):434–9, Fox et al Next Gener Seq Appl. 2014;1,

Artifactual noise: Shibutani et al Nature. 1991;349:431–434; Stiller et al Proc Natl Acad Sci U S A. 2006;103:13578–13584; Chen et al Science. 2017 Feb 17;355(6326):752-756; Costello et al Nucleic Acids Res. 2013 Apr 1;41(6):e67

PrimerID: Jabara et al. Proc Natl Acad Sci U S A. 2011;108(50):20166–71

Safe-Seq: Kinde et al Proc Natl Acad Sci U S A 2011;108(23):9530–5, Cohen et al 2021 Nature Biotechnology 39(10):1-8

Tam-Seq: Forshew et al Sci Transl Med 2012 May 30;4(136):136ra68; Gale et al PLoS One. 2018 Mar 16;13(3):e0194630

Duplex: Schmitt et al. Proc Natl Acad Sci U S A. 2012;109:14508–14513

CAPP-Seq/iDES: (Newman et al Nat Med 20, 548 (2014), Newman et al Nat Biotechnol 34, 547 (2016))

Tec-Seq: Phallen et al Sci Transl Med. 2017 Aug 16; 9(403)

Pro-seq: Pel et al PLoS One. 2018 Oct 2;13(10):e0204265

MAESTRO: Gydush et al Nat Biomed Eng. 2022 Mar;6(3):257-266

ssDNA-seq: Gansauge et al Nat. Protoc. 2013 8, 737–748.; Burnham, et al Sci. Rep. 6, 27859 (2016); Snyder et al Cell 164, 57–68 (2016).