# Advancing Forensic DNA Analysis in Support of DoD Missions

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# **Advancing Forensic DNA Analysis in Support of DoD Missions**

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#### **Traditional Forensic DNA Analysis**



- Short Tandem Repeats (STRs)  $\sum$
- Identity questions ONLY  $\sum_{i=1}^{n}$ 
	- § Is this person in a database (e.g., CODIS)?
	- **·** Is this person a suspect we've already identified?
	- Definitively establishes identity

#### **Advanced Forensic DNA Analysis**



- Single Nucleotide Polymorphisms (SNPs)
- Generate NEW leads
	- § What does this unknown person look like?
	- Is this unknown person related to someone we DO know? If so, how closely?
	- Is this unknown person related to volunteers in genetic genealogy databases?
	- § Generates leads, but identity is established through traditional methods

#### **DoD-Funded Projects**

- DTRA Phase I and Phase II SBIRs
- DNA Phenotyping Sequential Phase II SBIR

#### Distant Kinship . ARO Contract Analysis

• DTRA SBIR Modification

#### Genetic Genealogy | Kinship projects

• Direct result of Phenotyping and

Next-Generation • ARO Contract Sequencing (NGS) Analysis

#### **DoD-Funded Project Success**

#### • Commercialized for law DNA Phenotyping | enforcement • Commercialized for law enforcement • Transitioning to AFDIL Distant Kinship Analysis • Commercialized for law enforcement 111 solved cases (and counting!) Genetic Genealogy Next-Generation • Transitioned to DoD forensics labs Sequencing (NGS)

Analysis

# **DNA Phenotyping**

*Snapshot® : Predict the physical appearance of an unknown person from DNA*



## **DNA Phenotyping**

- **DoD Problem**: in theaters of war, a DNA database may not be available for traditional forensic DNA comparisons
- **DTRA SBIR solicitation goal:** given a DNA sample from an unexploded IED, predict the appearance of the person who planted it

#### **Ancestry Inference**

> >13,000 background subjects from >150 populations (aggregated from multiple studies for worldwide coverage)



#### **Ancestry Inference**

- > Tens of thousands of SNPs across the genome
- **> Very precise estimates of ancestry across as many** populations as are defined in the background
- Can detect even low levels of admixture (even when the mixture is between populations we haven't previously observed)

#### **Global Ancestry: Admixed Individual**

> Real results from an unknown individual given to us during a blind evaluation test



#### **Regional Ancestry: Admixed Individual**



Conclusion: This individual is half Japanese and half Latino  $\sum$ 

- Y chromosome haplogroup = O1b2a (most common in Japan and Korea)  $\sum_{i=1}^{n}$
- Therefore, this individual most likely has a Japanese father and a Central  $\sum$ American Latino mother

#### **Genome-Wide Association**

- Detect statistical associations between SNPs and a heritable phenotype  $\lambda$
- Requires a large genotype+phenotype (G+P) database of subjects with  $\sum_{i=1}^{n}$ known phenotype and genome-wide data



#### **Genome-Wide Association**

A strong statistical association suggests the SNP might be biologically  $\sum_{i=1}^{n}$ involved in the phenotype



#### **Interaction Analysis**

- > Single SNP association testing may not capture the whole story
- Many traits are influenced not only by individual SNPs but by nonadditive (epistatic) *interactions* among several SNPs
- However, looking for high-order interactions (e.g., 3, 4, and 5 factors) on a genome-wide scale results in a combinatorial explosion of possible models
	- § 8,333,250,000,000,000,000,000,000,000 (1027) possible 5-way interactions among 1 million SNPs
- Parabon has developed software (Crush-MDR) that uses a distributed evolutionary search algorithm to explore the massive space of possible interactions

#### **Genotype-to-Phenotype (G2P) Modeling**

- Supervised machine learning (ML)
- > Train the model using:
	- Known phenotype values
	- § Extracted features (selected SNPs, covariates such as ancestry and sex)
- **EXECUTE:** Learn a function to predict outcome from features
- **> Evaluate accuracy**

















- **This means we are performing data mining and predictive modeling 10** times for each phenotype
- > However, we now have out-of-sample predictions on every single subject in our dataset
- At the end, we build a final model using all of the data, and the crossvalidation accuracy approximates the accuracy of this final model
- Use the cross-validation results to make confidence statements about new predictions and *exclude* trait categories that are highly unlikely

#### **Face Morphology**

> Can we apply this same process to a complex phenotype, such as face morphology?



#### **Face Morphology**

- Face morphology is captured as a 3D face scan using a smartphone app
- The scan's shape is converted into thousands of quasi-landmarks (QLs), which are homologous across subjects
- Each QL has 3 coordinates (x,y,z), so faces are described by tens of thousands of numerical variables, many of which are correlated with one another
- > Principal component analysis (PCA) reduces the number of variables to a reasonable number while still retaining most of the variation





![](_page_27_Picture_1.jpeg)

![](_page_28_Picture_1.jpeg)

![](_page_29_Picture_1.jpeg)

# **Snapshot: Making Predictions**

![](_page_30_Picture_1.jpeg)

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#### **Global Ancestry**

> DNA from an unknown subject is partitioned into 7 parts according to its proportional similarity to each of the continental groups

0% 10% 20% 30% 40% 50% 60% 70% 80% 90% 100% ■ America ■ Oceania **□ East Asia** ■ Central Asia **Europe** ■ Middle East **Africa** 

#### **Regional Ancestry**

**>** Within each of the 7 continental populations, we can narrow the source of an individual's ancestry using the same statistical approach with different defined populations

![](_page_32_Figure_2.jpeg)

#### **G2P Prediction**

 $\triangleright$  Predicted Value = 1.560

![](_page_33_Figure_2.jpeg)

- Blue (50.4% confidence)  $\blacktriangleright$
- Blue or Green (85.1%  $\sum_{i=1}^{n}$ confidence)
- NOT Brown or Black (99.3%  $\sum$ confidence)

![](_page_33_Figure_6.jpeg)

## **Sample Results – Skin Color**

 $\triangleright$  Predicted Value = 2.002

![](_page_34_Figure_2.jpeg)

- Very Fair or Fair (92.9% confidence)
- NOT Light Brown, Brown, or  $\sum_{i=1}^{n}$ Dark Brown (92.9% confidence)

![](_page_34_Figure_5.jpeg)

## **Sample Results – Hair Color**

 $\triangleright$  Predicted Value = 1.670

![](_page_35_Figure_2.jpeg)

- Blond (80.7% confidence)  $\lambda$
- Blond or Brown (98.3%  $\sum_{i=1}^{n}$ confidence)
- NOT Black (98.4% confidence)  $\sum$

![](_page_35_Figure_6.jpeg)
## **Sample Results – Freckling**

 $\triangleright$  Predicted Value = 1.770



- Few (54.3% confidence)
- Few or Some (79.2% confidence)



### **Sample Results – Face Shape**

Predict the face and compare it to a face predicted using only sex and ancestry; heat maps show the differences



**x:** narrower jaw & chin; slightly wider nose & mouth



**z:** more protruding eyes & mouth; more recessed cheeks & chin



& chin

## **Sample Results – Face Shape**

- Caricaturize the face according to the heat maps, fit a head to it, and apply the predicted pigmentation
	- § Default age (25) and BMI (22)





- **Predictive models are built using high-quality data, so they assume that** the data they receive when making a prediction is also high-quality
- In casework, the DNA is of varying quality and quantity, and we need to take this into account when making predictions



- Genotyping call rates are never 100% with casework samples because of the small DNA quantities
	- We use a machine learning algorithm that allows for missing data (many do not)
	- § For each sample, we recalculate the cross-validation results and confidence intervals for that set of SNPs
- > DNA degradation results in short fragment lengths
	- § Optimized genotyping protocol for forensic samples
- Mixtures confuse both genotype calling and phenotype prediction
	- § We developed new computational methods to deconvolute mixtures



**Snapshot Prediction Results Snapshot Composite Profile** #CR20418-Annuary MA-Snanchar-R



**Snapshot Prediction Results** Snapsho **Composite Profile** 



**Snapshot Prediction Results Shapshot Composite Profile** 





#### **Snapshot Prediction Results Composite Profile**



#C920418-Agawam-MA-Snapshot-R01 NL Document #17118038-9FTVRN6R



- 1992 homicide of Lisa Ziegert in Agawam, MA
- Thousands of men listed in the  $\blacktriangleright$ case file
- Detectives used phenotyping  $\sum_{i=1}^{n}$ results to prioritize who to talk to, starting with the few who most closely matched the predictions
- > One of those men fled, eventually confessing to the crime
- His DNA matched the crime scene sample

#### **Snapshot Prediction Results Composite Profile**



#### 2009 homicide of Sierra Bouzigard in Lake Charles, LA

- For 6 years, detectives had been looking for a Hispanic male based on Sierra's cell phone history
- DNA phenotyping results were completely different
- Detectives released the composite  $\lambda$ to the public
	- A tip led to a suspect whose DNA matched the crime scene sample

# **Distant Kinship Inference**



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## **Kinship Inference**

- **DoD problem**: phenotype information isn't always enough
	- **Enemy groups sometimes have a familial connection**
	- § If a DNA sample doesn't directly match known individuals in a database, might it instead be related to someone in that database?
- **SBIR Modification**: Given DNA from two subjects, determine their degree of relatedness
- > Snapshot predictive models
	- Outcome is relationship between a pair of genomes
	- § Supervised machine learning using thousands of related and unrelated pairs, including families with members of different ethnic backgrounds

## **Kinship Inference Accuracy**



## **Kinship from Highly Degraded DNA**

- Snapshot Kinship requires high-quality data for tens of thousands of SNPs
- **Past accounting mission: identify missing soldiers from past conflicts by** matching their DNA to family references
	- Autosomal and Y STRs: limited success on highly degraded samples, require family references with specific relationships
	- Mitochondrial DNA (mtDNA): requires family references with specific relationships (direct maternal relatives)
- **DoD Problem**: Not all missing soldiers can be matched to their available family references using existing techniques
- **Collaboration with AFMES-AFDIL**: autosomal kinship from highly degraded DNA
	- DoD Office of the Deputy Assistant Secretary of Defense for Emerging Capabilities and Prototyping

## **Kinship from Highly Degraded DNA**

- Innovation:
	- Laboratory: new methods to obtain thousands of autosomal SNPs from highly degraded bone samples
	- **Bioinformatics: determine kinship from sparse, low-quality data**



Blind test: successfully matched samples from as far back as World War II to family references

§ Transitioning to AFDIL

# **Genetic Genealogy**



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#### **Procedure**

- 1. Generate DNA data from a forensic sample from an unknown subject
- 2. Upload DNA data to a database to find other individuals that share DNA with the subject

### **How does it work?**

- A child inherits one copy of each chromosome from their father and one from  $\sum_{i=1}^{n}$ their mother
- The chromosomes recombine, so each parent passes on a version that is a  $\lambda$ *combination* of their own two copies



### **How does it work?**

Recombination happens randomly for each child, so full siblings do not  $\sum_{i=1}^{n}$ inherit the same copies



#### **How does it work?**

The more distantly related two subjects are, the smaller the shared segments become as they are broken up by recombination



### **Detecting Shared Segments**

- **Common to share at least one allele at a SNP, but not common to have** long uninterrupted stretches of shared alleles unless the two individuals inherited that DNA from a common ancestor
- Look for shared segments that are long enough to be highly unlikely to be shared by chance



## **Relatedness Using SNPs**



## **Genetic Genealogy Databases**

- Law enforcement usage allowed for unidentified remains and violent crimes
	- § GEDmatch
	- § FamilyTreeDNA (FTDNA)
- > No law enforcement usage
	- § 23andMe
	- § AncestryDNA
	- § MyHeritage

#### **Database Searching**

- Compare queried file to all opted-in users' files  $\sum_{i=1}^{n}$
- Only the amount and location of shared DNA is shown, **not the DNA itself**



Largest segment =  $44.4$  cM Total of segments  $> 7$  cM = 71.5 cM 3 matching segments Estimated number of generations to  $MRCA = 3.8$ 

406488 SNPs used for this comparison.

#### **Procedure**

- 1. Generate DNA data from a forensic sample from an unknown subject
- 2. Upload DNA data to a database to find other individuals that share DNA with the subject
- 3. Build family trees back in time to possible common ancestors using public records

## **Genetic Genealogy**

- Total shared DNA: 300 cM
- The amount of sharing can be consistent with multiple possible degrees of relatedness
- > Each degree of relatedness has multiple possible relationship types













- Records are not always available
- Biological family trees don't always match family trees on paper  $\sum_{i=1}^{n}$ 
	- **Misattributed paternity**
	- § Unknown parentage
	- Adoption

#### **Procedure**

- 1. Generate DNA data from a forensic sample from an unknown subject
- 2. Upload DNA data to a database to find other individuals that share DNA with the subject
- 3. Build family trees back in time
- 4. Identify all of the other descendants of those common ancestors at the right genetic distance to be the Subject









- > Not all descendants can be identified
	- § Out of wedlock births
	- **Misattributed parentage**
	- § Families can be very large
#### **Procedure**

- 1. Generate DNA data from a forensic sample from an unknown subject
- 2. Upload DNA data to a database to find other individuals that share DNA with the subject
- 3. Build family trees back in time
- 4. Identify all of the other descendants of those common ancestors at the right genetic distance
- 5. Narrow down the possible identities

### **Narrowing the search**

- Demographic criteria  $\sum_{i=1}^{n}$ 
	- § Sex of the subject
	- Date of the crime
	- § Location of the crime
- Genetic sharing between matches (triangulation)
- Ancestry and Phenotype predictions  $\sum_{i=1}^{n}$
- Targeted Kinship testing  $\lambda$

- If there are multiple matches to the subject that don't share DNA with each other, they represent different branches of the subject's family tree
- The goal is to find an intersection between their family trees (a marriage or out-of-wedlock birth)



















Jay Cook Tanya Van Cuylenborg

- 1987 double murder of Jay Cook (20) and Tanya Van Cuylenborg (18)
- Snohomish County, WA  $\sum$

#### **Snapshot Prediction Results Composite Profile**



#SCSO-WA-87-9340-Snapshot NL Document #18E22K40-F779FWM







#### **Cook/Van Cuylenborg Double Homicide Cold Case**

Suspect family tree based on genetic genealogy











- 1986 homicide of 12-year-old Michella Welch  $\sum_{i=1}^{n} x_i$
- > Tacoma, Washington



Michella Welch, 12



- **Predicted genetic ancestry: 90% Northern European +** 10% North Native American
- **Top two matches in GEDmatch shared no DNA**
- Pair of brothers of possible interest
	- § Cousins to Match #1
	- § Lived in Tacoma in 1986
	- Had two Native American great-great-grandmothers (~1/8 Native American)
	- $\blacksquare$  But  $\blacksquare$

> One degree closer than expected given amount of shared DNA; no connection to match #2



Match #1's Relative and Match #2's Relative lived in the same small town in the year before the Cousins' Ancestor was born



Misattributed paternity can account for the amount of shared DNA and the connection to Match #2



#### **Forensic Analysis of Next-Generation Sequencing (NGS) Data**

# PARABON® F Forensic Analysis Platform



#### **Forensic NGS**

- **> NGS** is a powerful new tool for forensics
	- STRs and SNPs in a single assay
	- § Sequencing STRs yields additional alleles that are helpful for answering identity questions and analyzing mixed samples

#### **Forensic NGS**

- **DoD problem**: multiple NGS system manufacturers, each with their  $\sum_{i=1}^{n}$ own proprietary software
	- § Can't compare samples across NGS kits
	- § Analytical capabilities are limited to those tools included in manufacturers' software
- **Solicitation**: platform-agnostic software that can analyze STRs, SNPs, and mitochondrial DNA from NGS data

#### **Forensic NGS**

- Parabon Fx™ Forensic Analysis Platform
	- § Analyze raw data from any NGS system and compare across kit types
	- **Extensible platform with a plugin architecture**
	- § Dozens of built-in plugins provide extensive analytical capabilities
	- § Can be installed on a local server or accessed over the internet
	- § CAC card access, STIG-compliant

#### **NGS STRs**

Create, edit, and approve an STR profile using allele length or sequence



#### **NGS STRs**

Compare STR profiles for identity, Y-chromosome lineage, parentage, or sibship using length or sequence alleles



#### **NGS STRs**

#### > Deconvolute mixed STR profiles using length or sequence alleles



#### **NGS SNPs**

Align sequence reads to the reference genome and call a SNP profile



#### **NGS SNPs**

#### > Perform identity matching, infer ancestry, predict phenotype

#### **3** Sequence Data SNP Identity Match Results



#### **NGS mtDNA**

Create a mitochondrial DNA sequence profile and perform haplotypebased or string-based lineage matching



### **Microarray Plugins**

The DoD distribution of Fx also includes plugins for ancestry,  $\sum_{i=1}^{n}$ phenotype, and kinship analysis of SNP microarray data using Snapshot



Relationship

#### **Fx Extensions**

- > New analyses developed by Parabon can quickly be distributed to DoD users as Fx plugins
	- § Kinship analysis of highly degraded DNA
	- § Ancestry analysis of highly degraded DNA
	- **Automated pedigree reconstruction**
	- **Automated mixture deconvolution**
	- § Etc.

## **Questions?**

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