

Exploiting AI To Improve DNA Damage Detection and Quantification.

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ABSTRACT

Rational: The CometChip assay is a well established, high throughput, in-vitro method for the detection and quantification of DNA damage in cells based on the Comet assay, developed in 1984. Current commercially available analysis software is expensive, proprietary, and requires manual input from the user. Manipulation of data analysis by eye increases the amount of time necessary to analyze each image dataset and introduces bias that can affect DNA damage quantification. This projects aims to use machine learning to train an image analysis algorithm that can ultimately be used to fully automate image analysis. Fluorescent images of electrophoresed comets must be analyzed to calculate the extent of DNA damage. Expensive commercially available analysis software is used to determine the main parameter which is the cutoff between the "head" (intact DNA with low mobility) and the "tail" (damaged DNA with higher mobility) of the comet. The percentage of total DNA in the tail represents the amount of damage. Current software cannot determine the quality of individual comets, and often the software places the cutoff line far from the correct location forcing users to painstakingly manually sift through hundreds (a very small dataset) to hundreds of thousands (a large dataset) of images "improve" their data by manually eliminating debris/non analyzable comets, and setting the head/tail cutoff by eye. This will eliminate the possibility of manual input from users, greatly increasing throughput (by orders of magnitude, in some cases) and providing objective and consistent analysis parameters.

Comet vs CometChip Assay: the Comet assay relied on randomly patterned cells on an agarose coated glass slide, this led to significant overlapping when overloaded, and few cells on the plate when underloaded, creating high degrees of variability in data quality between slides, as well as a low number of images per slide even under ideal loading conditions. The CometChip assay exploits micro-patterned micro-wells in agarose that can be separated into the "macro" wells of a typical 96 well plate.

Current progress
 machine learning has been applied to both automation steps, leading to a 99.7% (9997/1000) screening of debris or non-uniform comets in the first step, and an over 95% correct cutoff determination in the second step. We will soon be incorporating these into a free to use program that will be compared with existing software.

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The Comet Assay

No Damage

 Nucleoid

High Strand Breaks

 Head Tail

Electrophoretic Migration Reveals DNA Strand-Breaks
 Modified from Wood D et al. 2010. PNAS 107:10008-10013

In vivo comet assay is adopted in regulatory guidelines

- Genotoxicity testing (OECD, 2014)¹
- Standard test battery (FDA, 2012)²

In vitro comet assay adapted in Japan and EU, not the US

- Lack of sensitivity in detection of bulky adducts

Traditional comet assay is laborious and low-throughput

1. OECD/OCDE TG 489. 2014. OECD guideline for the testing of chemicals.
 2. U.S. Dept of Health and Human Services, Food and Drug Administration. 2012. Guidance for industry.

The CometChip Platform

The CometChip increases throughput ~1000 fold

Untreated
 DNA Damage

CometChip Images Have Variable Quality

Good representative image Bad representative image

Callable
 Not Callable

Task I: Identify Analyzable Comets

Label for Task I: one-hot vector [0, 1] [1, 0]

Network: modified ResNet 18

Softmax function

$$\sigma(\vec{z})_i = \frac{e^{z_i}}{\sum_{j=1}^K e^{z_j}}$$

Output: a vector with two elements added to 1
 e.g. [0.99, 0.01] indicates a bad comet

Task II: Detect Cutoffs For Head and Tail

Label for Task II: vector of cutoff bar positions [0.1, 0.46, 0.86]

Normalization among all training comets:

$$x' = \frac{x - \text{mean}(x)}{\text{std}(x)}$$

[-1.1097, 0.8080, -0.2710]

Output: a vector with three elements

Network: modified ResNet 18

Result from Task I

1949 good comets; 1174 bad comets; In total: 3123
>99% of odd comets and debris automatically removed

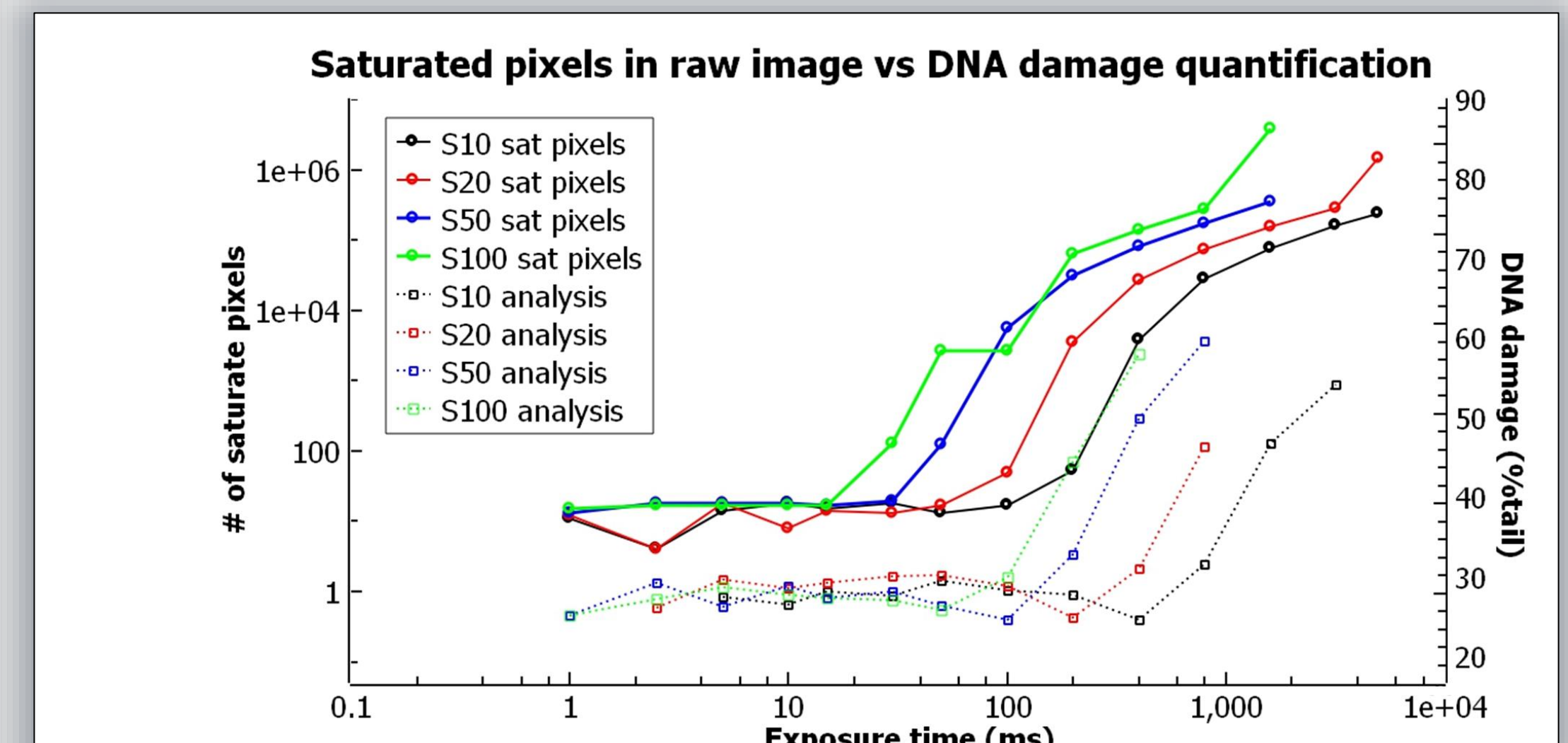
Odd comets/debris Comets

Result from Task II

1949 good comets; 1871 correct head/tail cutoff
>96% of cutoffs at correct position

Saturation Issues and Comet Tail Over-Counting

Determining guidelines for Pixel Saturation



Conclusions and Significance

- The CometChip platform is robust and high-throughput, will soon have a free and equally high throughput analysis software
- Machine learning is capable of producing very high accuracy in results without input from user.
- Ideal exposure times have been empirically determined and guideline set for the effects of image pixel saturation which will be accounted for in finished product.
- Once completed, this open-source, free software will remove any fiscal hurdles for CometChip image analysis, and drastically increase throughput and fidelity of DNA damage quantification using CometChip.