## CAME: Identification of Chromatin Accessibility from Nucleosome Occupancy and Methylome Sequencing

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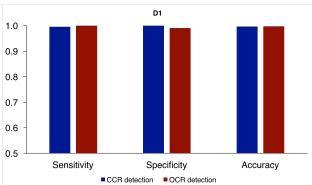
| Supplementary Algorithm 1. Seed detection   |  |  |  |  |
|---|--|--|--|--|
| Input: $\delta$ , d   |  |  |  |  |
| 1. for $i \leftarrow 1$ to N d  |  |  |  |  |
| 2. <b>if</b> $(\beta_i \leq \delta)$ then   |  |  |  |  |
| 3. $startPosition \leftarrow GCH_i$   |  |  |  |  |
| 4. <b>while</b> $(\beta_i > \delta \text{ or } distance(GCH_i, GCH_{i+1}) > d)$   |  |  |  |  |
| 5. $i \leftarrow i+1$   |  |  |  |  |
| 6. endwhile   |  |  |  |  |
| 7. $endPostion \leftarrow GCH_i$  |  |  |  |  |
| 8. $average \leftarrow calculate(startPosition, endPosition)$   |  |  |  |  |
| 9. insert(startPosition, endposition, average) to S'  |  |  |  |  |
| 10. endif   |  |  |  |  |
| <ul> <li>average ← calculate(startPosition, endPosition)</li> <li>insert(startPosition, endposition, average) to S'</li> <li>endif</li> <li>endfor</li> </ul> |  |  |  |  |
| 12. return <i>S</i> ′   |  |  |  |  |

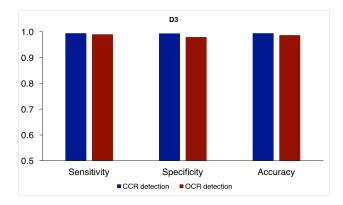
| Input: $S', \mu, \varepsilon, d, \Delta$<br>1. while ( $\forall S$ is considered, $S \in S'$ )<br>2. $S_i \leftarrow selectStartingPoint(S')$<br>3. while (!stopCondition)<br>4. (peak, valley) $\leftarrow$ searchNextPeakValley( $S_i$ )<br>5. tempAverage1 $\leftarrow$ calculate( $S_i$ , valley)<br>6. tempAverage2 $\leftarrow$ calculate( $S_{i+1}$ , valley)<br>7. if ( $\beta_{peak} < \Delta$ and tempAverage1 $\leq \mu$ and tempAverage2 $\leq \varepsilon$ )<br>8. $S_i \leftarrow$ extendSeed( $S_i$ , valley)<br>9. else<br>10. (ave, std) $\leftarrow$ npMixture()<br>11. for $j \leftarrow S_j$ to valley do<br>12. if ( $\beta_{j+1} > ave + std$ ) then stop<br>13. endfor<br>14. $S_i \leftarrow$ extendSeed( $S_i, j$ )<br>15. stopCondition $\leftarrow$ true<br>16. endif<br>17. endwhile<br>18. insert( $S_i$ ) to $R'$<br>19. endwhile |  |
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| 1. while ( $\forall S$ is considered, $S \in S'$ )2. $S_i \leftarrow selectStartingPoint(S')$ 3. while (! stopCondition)4. (peak, valley) $\leftarrow$ searchNextPeakValley( $S_i$ )5. tempAverage1 $\leftarrow$ calculate( $S_i$ , valley)6. tempAverage2 $\leftarrow$ calculate( $S_{i+1}$ , valley)7. if ( $\beta_{peak} < \Delta$ and tempAverage1 $\leq \mu$ and tempAverage2 $\leq \varepsilon$ )8. $S_i \leftarrow$ extendSeed( $S_i$ , valley)9. else10. (ave, std) $\leftarrow$ npMixture()11. for $j \leftarrow S_j$ to valley do12. if ( $\beta_{j+1} > ave + std$ ) then stop13. endfor14. $S_i \leftarrow$ extendSeed( $S_i, j$ )15. stopCondition $\leftarrow$ true16. endif17. endwhile18. insert( $S_i$ ) to $R'$ 19. endwhile  | Supplementary Algorithm 2. Seed extension  |
| 2. $S_i \leftarrow selectStartingPoint(S')$<br>3. while (! stopCondition)<br>4. $(peak, valley) \leftarrow searchNextPeakValley(S_i)$<br>5. $tempAverage1 \leftarrow calculate(S_i, valley)$<br>6. $tempAverage2 \leftarrow calculate(S_{i+1}, valley)$<br>7. if $(\beta_{peak} < \Delta$ and $tempAverage1 \le \mu$ and $tempAverage2 \le \varepsilon$ )<br>8. $S_i \leftarrow extendSeed(S_i, valley)$<br>9. else<br>10. $(ave, std) \leftarrow npMixture()$<br>11. for $j \leftarrow S_j$ to valley do<br>12. if $(\beta_{j+1} > ave + std)$ then stop<br>13. endfor<br>14. $S_i \leftarrow extendSeed(S_i, j)$<br>15. $stopCondition \leftarrow true$<br>16. endif<br>17. endwhile<br>18. $insert(S_i)$ to $R'$<br>19. endwhile   | <b>Input:</b> $S', \mu, \varepsilon, d, \Delta$  |
| 3. while $(! stopCondition)$<br>4. $(peak, valley) \leftarrow searchNextPeakValley(S_i)$<br>5. $tempAverage1 \leftarrow calculate(S_i, valley)$<br>6. $tempAverage2 \leftarrow calculate(S_{i+1}, valley)$<br>7. $if(\beta_{peak} < \Delta \text{ and } tempAverage1 \le \mu \text{ and } tempAverage2 \le \varepsilon)$<br>8. $S_i \leftarrow extendSeed(S_i, valley)$<br>9. else<br>10. $(ave, std) \leftarrow npMixture()$<br>11. $for j \leftarrow S_j$ to valley do<br>12. $if(\beta_{j+1} > ave + std)$ then stop<br>13. endfor<br>14. $S_i \leftarrow extendSeed(S_i, j)$<br>15. $stopCondition \leftarrow true$<br>16. endif<br>17. endwhile<br>18. $insert(S_i)$ to R'<br>19. endwhile   | 1. while $(\forall S \text{ is considered}, S \in S')$   |
| 4. $(peak, valley) \leftarrow searchNextPeakValley(S_i)$<br>5. $tempAverage1 \leftarrow calculate(S_i, valley)$<br>6. $tempAverage2 \leftarrow calculate(S_{i+1}, valley)$<br>7. $if(\beta_{peak} < \Delta \text{ and } tempAverage1 \leq \mu \text{ and } tempAverage2 \leq \varepsilon)$<br>8. $S_i \leftarrow extendSeed(S_i, valley)$<br>9. else<br>10. $(ave, std) \leftarrow npMixture()$<br>11. $for j \leftarrow S_j$ to valley do<br>12. $if(\beta_{j+1} > ave + std)$ then stop<br>13. endfor<br>14. $S_i \leftarrow extendSeed(S_i, j)$<br>15. $stopCondition \leftarrow true$<br>16. endif<br>17. endwhile<br>18. $insert(S_i)$ to R'<br>19. endwhile   | 2. $S_i \leftarrow selectStartingPoint(S')$  |
| 5. $tempAverage1 \leftarrow calculate(S_i, valley)$<br>6. $tempAverage2 \leftarrow calculate(S_{i+1}, valley)$<br>7. $if(\beta_{peak} < \Delta \text{ and } tempAverage1 \le \mu \text{ and } tempAverage2 \le \varepsilon)$<br>8. $S_i \leftarrow extendSeed(S_i, valley)$<br>9. else<br>10. $(ave, std) \leftarrow npMixture()$<br>11. $for j \leftarrow S_j \text{ to } valley \text{ do}$<br>12. $if(\beta_{j+1} > ave + std) \text{ then stop}$<br>13. endfor<br>14. $S_i \leftarrow extendSeed(S_i, j)$<br>15. $stopCondition \leftarrow true$<br>16. endif<br>17. endwhile<br>18. $insert(S_i)$ to R'<br>19. endwhile  | 3. while (! <i>stopCondition</i> )   |
| 6. $tempAverage2 \leftarrow calculate(S_{i+1}, valley)$<br>7. $if(\beta_{peak} < \Delta \text{ and } tempAverage1 \le \mu \text{ and } tempAverage2 \le \varepsilon)$<br>8. $S_i \leftarrow extendSeed(S_i, valley)$<br>9. else<br>10. $(ave, std) \leftarrow npMixture()$<br>11. $for j \leftarrow S_j \text{ to valley do}$<br>12. $if(\beta_{j+1} > ave + std)$ then stop<br>13. endfor<br>14. $S_i \leftarrow extendSeed(S_i, j)$<br>15. $stopCondition \leftarrow true$<br>16. endif<br>17. endwhile<br>18. $insert(S_i)$ to R'<br>19. endwhile  | 4. $(peak, valley) \leftarrow searchNextPeakValley(S_i)$   |
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| 8. $S_i \leftarrow extendSeed(S_i, valley)$<br>9. else<br>10. $(ave, std) \leftarrow npMixture()$<br>11. for $j \leftarrow S_j$ to valley do<br>12. if $(\beta_{j+1} > ave + std)$ then stop<br>13. endfor<br>14. $S_i \leftarrow extendSeed(S_i, j)$<br>15. $stopCondition \leftarrow true$<br>16. endif<br>17. endwhile<br>18. $insert(S_i)$ to $R'$<br>19. endwhile  | 6. $tempAverage2 \leftarrow calculate(S_{i+1}, valley)$  |
| 9. else<br>10. $(ave, std) \leftarrow npMixture()$<br>11. for $j \leftarrow S_j$ to valley do<br>12. if $(\beta_{j+1} > ave + std)$ then stop<br>13. endfor<br>14. $S_i \leftarrow extendSeed(S_i, j)$<br>15. $stopCondition \leftarrow true$<br>16. endif<br>17. endwhile<br>18. $insert(S_i)$ to $R'$<br>19. endwhile   | 7. <b>if</b> $(\beta_{peak} < \Delta \text{ and } tempAverage1 \le \mu \text{ and } tempAverage2 \le \varepsilon)$ |
| 10. $(ave, std) \leftarrow npMixture()$ 11.       for $j \leftarrow S_j$ to valley do         12.       if $(\beta_{j+1} > ave + std)$ then stop         13.       endfor         14. $S_i \leftarrow extendSeed(S_i, j)$ 15.       stopCondition \leftarrow true         16.       endif         17.       endwhile         18.       insert(S_i) to R'         19.       endwhile   | 8. $S_i \leftarrow extendSeed(S_i, valley)$  |
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| 13.       endfor         14. $S_i \leftarrow extendSeed(S_i, j)$ 15. $stopCondition \leftarrow true$ 16.       endif         17.       endwhile         18. $insert(S_i)$ to $R'$ 19.       endwhile  | 11. <b>for</b> $j \leftarrow S_j$ to valley <b>do</b>  |
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| 15. $stopCondition \leftarrow true$<br>16. endif<br>17. endwhile<br>18. $insert(S_i)$ to $R'$<br>19. endwhile   | 13. endfor   |
| 16.endif17.endwhile18. $insert(S_i)$ to R'19.endwhile   | 14. $S_i \leftarrow extendSeed(S_i, j)$  |
| 17.endwhile18. $insert(S_i)$ to R'19.endwhile   | 15. $stopCondition \leftarrow true$  |
| 18. $insert(S_i)$ to $R'$<br>19. endwhile   | 16. endif  |
| 19. endwhile  | 17. endwhile   |
|   | 18. $insert(S_i)$ to $R'$  |
| 20 return R'  | 19. endwhile   |
| Lo. Ictuin A  | 20. return <i>R</i> ′  |

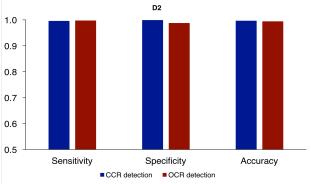
Supplementary Table. 1. Performance change of CAME by CCR and OCR detection methods. For the OCR detection method, parameters d=150,  $\Delta=0.6$ , and  $(\delta, \varepsilon) = (0.9, 0.6)$ , (0.8, 0.5), (0.7, 0.5), and (0.6, 0.5) were used.

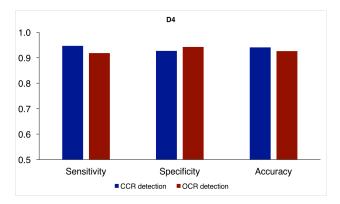
|    | CCR detection |             |          | OCR detection |             |          |
|----|---------------|-------------|----------|---------------|-------------|----------|
|    | Sensitivity   | Specificity | Accuracy | Sensitivity   | Specificity | Accuracy |
| D1 | 0.9954        | 0.9999      | 0.9968   | 0.9997        | 0.9907      | 0.9970   |
| D2 | 0.9964        | 0.9997      | 0.9974   | 0.9976        | 0.9884      | 0.9948   |
| D3 | 0.9941        | 0.9928      | 0.9937   | 0.9901        | 0.9788      | 0.9866   |
| D4 | 0.9470        | 0.9271      | 0.9408   | 0.9188        | 0.9425      | 0.9261   |

Supplementary Fig. 1. Bar charts of performance change of CAME by CCR and OCR detection methods

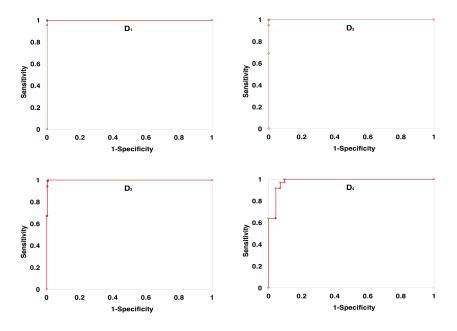




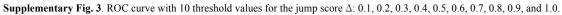


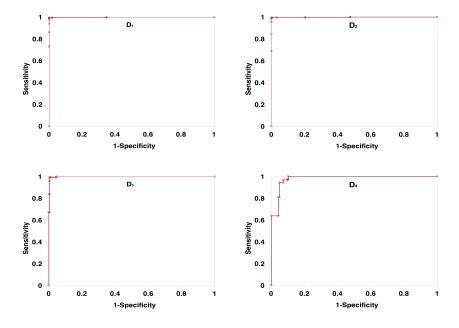


## D1 1.0 0.9 - D2 0.9 - D

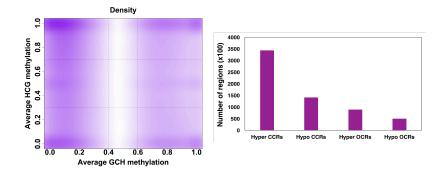


Supplementary Fig. 2. ROC curve with 10 threshold values for the average methylation score &: 0.1, 0.2, 0.3, 0.4, 0.5, 0.6, 0.7, 0.8, 0.9, and 1.0.





**Supplementary Fig. 4**. The left plot shows a scatter plot between chromatin accessibility and DNA methylation where each x-pixel indicates average GCH methylation score and each y-pixel represents average HCG methylation score of a CCR (OCR), and each point has different degree of the color (light to dark) based on its density. The top and bottom left (right) quadrants represent hyper- and hypo-methylated CCRs (OCRs), respectively. The right plot shows histograms for the number of detected regions for each of the categories (hypo- and hyper-methylated CCRs and OCRs). CCRs (OCRs) with HCG methylation score that are > 0.7 were considered as hyper-methylated and those with HCG methylation score that are < 0.3 were defined as hypo-methylated. The histogram shows the number of detected regions for each of the categories.



Supplementary Fig. 5. DAVID analysis for hyper-methylated CCRs (A) and OCRs (B), and hypo-methylated CCRs (C) and OCRs (D).

