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## Abstract

## $PCE \quad P \ E_i$ .

## $FWE \quad P \quad _iE_i$ .

] $v \in s$ ; $v_{i} = a_{i} \in [m_{i} = i]$			
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v.a ] 3.4	T	S	m
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 $FDR \quad E \ V/R$ ,

• • ] • , V/R , find the set of the set o

$$FDR PR > PV > FWE.$$

 $FWE P _{i}E_{i} P E \cdots P E_{m} m\alpha' \alpha.$ 

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$$E \hspace{0.1 cm} d \hspace{0.1 cm} S \hspace{0.1 cm} \pi \hspace{0.1 cm} {}^{-(m+ \hspace{0.1 cm})/} \hspace{0.1 cm} W^{-m} p_i^{-m} \hspace{0.1 cm} \bullet \hspace{0.1 cm} -p_i/ \hspace{0.1 cm} .$$

ese a ane]a a fi sarae da ango seyraa s]  $[T/_{\gamma} \circ] \circ_{A} \circ_{A} \circ \bullet \bullet \bullet \bullet \circ_{\gamma} \circ_{A} \circ_{\gamma} \bullet \bullet \circ \circ_{\gamma} \circ_{A} \circ_{\gamma} \bullet \bullet \circ \circ_{\gamma} \circ_{A} \circ_{\gamma} \circ_{\gamma} \circ_{\gamma} \circ_{A} \circ_{\gamma} \circ$  $[T_{i}] = [T_{i}] = [T_{$ • • ] كم مم ك] ب ] • ] م م ب ] • م أَوَ مُهَاتُه م • • • ك] كمبرمات • • ك] • م [ • ] • ] • م • ] • م • ] • م • ] • م • ] 3  $\bullet$  a a a b a a b a a b a a b • app a • • 3] 3aa ap • ] a a p ] • a 5 2 p • • 3] 3aa ap • 7 p ] ] T a P a 3aa a a anter v sa s a sa saa as aa jiraar v به [د[ دیهد ] به چې از په به د (i ] به به د ت د به از مه [ به [د به به قَحَالَ إِنَّا مِنْ ٩ هِ ٩ هِ [ دَنْبَعَ مِهْدَ[ دَمَنْ مَحَدَ هِ مَ ] مَ عَدَ اللَّهُ اللَّهُ اللَّهُ ال م] معمد م الم معمد ( الم مع معمد ( الم مع الم معمد ( الم  $[\mathbf{r}_{\mathbf{r}}, \mathbf{r}_{\mathbf{r}}]$ سهد ب[اب د <del>ته</del>یرد[ بد ب⊷ به به[د[ د به م به د ب به به د [ب] د ب ••] 34 3 4 34 T AT 0 4 4 4 4 ] yy 44 3 4 4 4 4 3 به[ دېم پ[ \_\_اچېد[یېد[۳۰-[به مړیې په د \_ېېېم و[پ په پېېېد[د یې و د د د چې ] ] . ] 

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بلم عباته [ به م [ به م عبر الم الم الم عبر الم الم عبر الم الم عبر الم الم الم عبر الم الم الم الم ا  $\mathbf{A} = \left[\mathbf{A} + \mathbf{A} + \mathbf{A}$  $p_{(i)} = \frac{i}{m} \frac{q}{\sum_{i=1}^{n} i}.$ • t<sub>2</sub>  $pFDR \quad E \ V/R/R > \quad .$  $pFDR \quad p \quad P \quad H_i \quad (|T_i| > \gamma),$ د ۲۰ [ به محمد [ د برد برد محمد [ محمد ] معد [ معمه محمد ] محمد [ مع معمه محمد مع • , , , , , ] :  $|T_i| > \gamma$  • , pFDR E V/R/R > $E_{R>}$ , E V/R/R $E_{R>}$  p V S / V S p.

 $\begin{array}{c} \cdot \neg + \gamma + a^{2} \cdot |e| \\ \cdot |e|$ 

$$pFDR \quad q \qquad p_{(i)} \quad \frac{i}{m}q.$$

 $(\overline{x}, \overline{x}, \overline{y}, \overline{y$ 

••• 
$$\gamma$$
 a 2 a  $\gamma$  a  $\gamma$ 

$$E\left[\frac{R \ \gamma}{R \ \gamma \ S \ \gamma}\right] \quad (\gamma \ C \left[\frac{V \ \gamma}{V \ \gamma \ S \ \gamma}\right].$$

 $\rightarrow \gamma$  ,  $\gamma$  ,  $\gamma$  ,  $\gamma$  ,  $\gamma$  ,  $\gamma$  ,  $\gamma$  ,  $\gamma$ 

$$S \gamma = R \gamma - mp_{\gamma},$$

$$\widehat{FDR}_{YB} \gamma \qquad E\left[\frac{R \quad \gamma}{R \quad \gamma \quad S \quad \gamma}\right].$$

$$\begin{array}{c} \bullet & \bullet \\ \gamma \end{array} ] \begin{array}{c} \bullet & \bullet \\ \gamma \end{array} ]_{f} \quad b \quad \bullet \\ \bullet & \bullet \end{array} \end{array} \begin{array}{c} R^{b} \quad \gamma \end{array} \begin{array}{c} \bullet & \bullet \\ \bullet & \bullet \end{array} \left[ t_{i}^{b} \right]_{r} \quad \bullet \\ \bullet \\ \bullet \end{array} \begin{array}{c} \bullet \\ \delta \end{array} \begin{array}{c} \bullet \\ \bullet \end{array} \right]_{f} \qquad \bullet \\ \gamma \end{array}$$

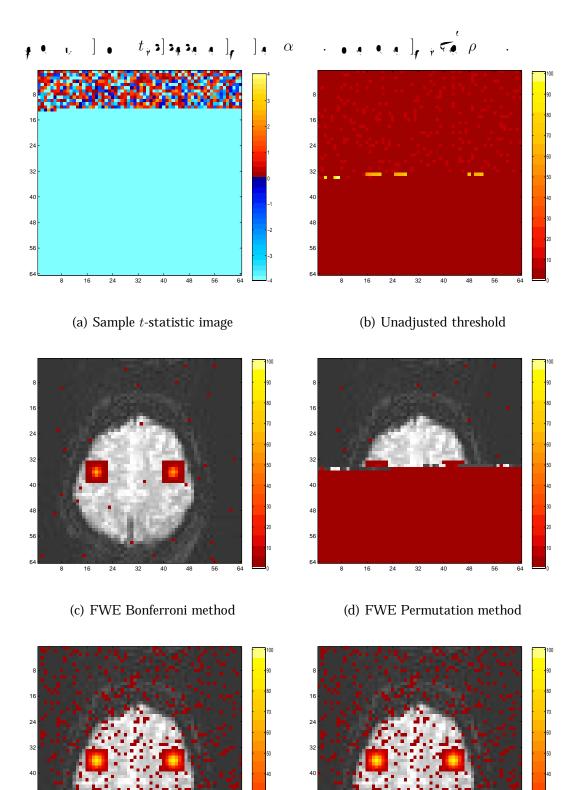
$$\widehat{FDR}_{YB} \gamma = \sum_{b=1}^{B} \left[ \frac{R^{b} \gamma}{R^{b} \gamma - S \gamma} \right].$$

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ې د به به د د کې [ د د به به به د د به به د اید [ به د به به به د د ب ]**. ⊮**]]> --- 3 [ بن بن بن به به محمد [ لهد [ ب ]] م ممنو هر هر الم عمد منه [ حال من من م Va , 3], a] . 50 a 5 a 200 a 5 a Va , a ] بېړډ (دې بې•• به [بد د[ ۹ب به ←∽-- $[\mathbf{x}_{\mathbf{x}}] = \mathbf{x}_{\mathbf{y}} = \mathbf{x}_{\mathbf{y}} = \mathbf{x}_{\mathbf{x}} = \mathbf{x}_{\mathbf{x}}$  $\mathbf{v}_{\mathbf{a}}$ ,  $\mathbf{a}$  ] n  $\mathbf{a}_{\mathbf{a}}$ ,  $\mathbf{a}_{$ Y X B E $n \times p$   $n \times q$  q  $\times p$   $n \times p$ [a, a] ] [a, a] ] [a, a] [a, a] [a, a] [a, a] [a, a] [a, a]] a ay faysa ag ] a n a ay ana] V sa a ay sa a a ag ] s] a n

A AVANA]  $\forall 20 a = 2 a + 3 a + 3 a + 4 a + 3 a + 4 a + 3 a + 4 a + 3 a + 4 a + 3 a + 4 a$ 

$$B \ i, j \qquad e^{-\frac{(i-i')^2 + (j-j')^2}{2(2)}}$$



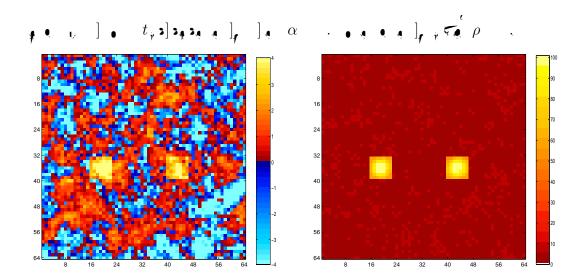
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5 24 32 40 48 56 (f) FDR YB method

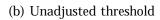
(e) FDR BH method

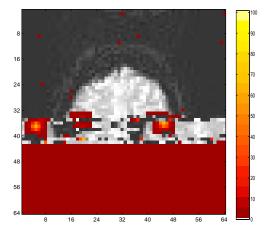
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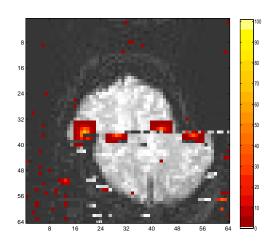


(a) Sample *t*-statistic image

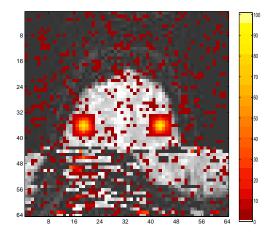


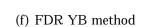


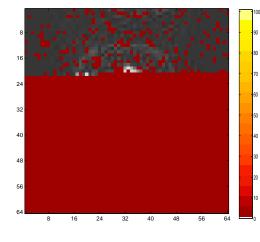
(c) FWE Bonferroni method



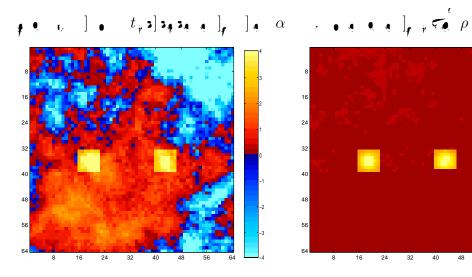
(d) FWE Permutation method



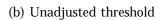




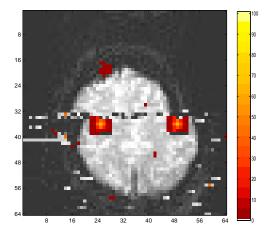
(e) FDR BH method



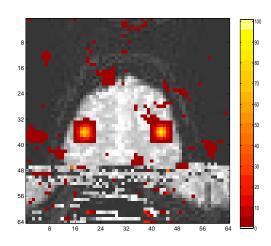
(a) Sample *t*-statistic image



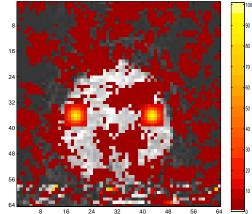
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(c) FWE Bonferroni method

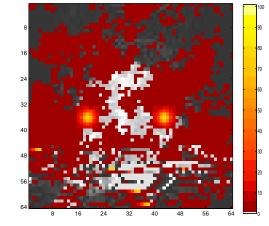


(d) FWE Permutation method





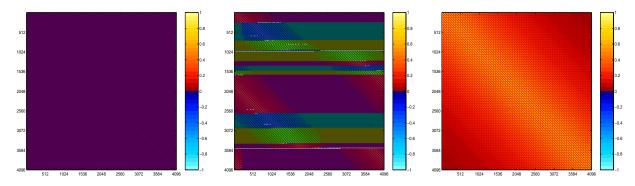
(f) FDR YB method



(e) FDR BH method

 $= \mathbf{f}_{\mu} \mathbf{s}_{\mu} + \mathbf{f}_{\mu} \mathbf{e}_{\mu} \mathbf{f}_{\mu} \mathbf{e}_{\mu} \mathbf{f}_{\mu} \mathbf{e}_{\mu} \mathbf{f}_{\mu} \mathbf{e}_{\mu} \mathbf{e}_$  $\cdot$  at  $[a, a_{i}, a_{j}, a_{$  $\mathbf{x}_{i0}$  ]  $\mathbf{x}_{i}$  ]  $\mathbf{x}_{i}$  ,  $\mathbf{x}_{i}$  ]  $\mathbf{x}_{i}$  ,  $\mathbf{x}_{i}$  ]  $\mathbf{x}_{i}$   $\mathbf{x}_{i}$  ]  $\mathbf{x}_{i}$  ]  $\mathbf{x}_{i}$   $\mathbf{x}_{i}$  ]  $\mathbf{x}_{$  $[]_{\mu}$   $a^{22}$   $[]_{\mu}$   $a^{2}$   $a^{2}$  a; a]e aa; ]a a a a a - 3a ]; ; e a a ]; > ρ · ; a]e aa ښم[ به 3[ به ښد ډبه به به ۲۵ [ 3[ ۲] به م[ به ۳۰۰ به ۲۹۹  $[\mathbf{a}, \mathbf{a}] \mathbf{e} = \mathbf{a} = \mathbf$ مېمد [ چې چې جې د ff په چې د دنې په د په د په چې په چېد [ چې [مد [ م. د م. په د ، د به به د به ب AARAA4,  $e_A$   $e_$ · a ] a. Ta ] a g a va , ] ]. Jaa. Ta a ve. Ta e sa  $[a_{A}] \times \forall \overline{A} \quad A_{A} \quad$ - Ay 2 AF 2 y - Ay 2 A - A + A - A + A - 3 + 2 + 2 + 3 + 0 [Ay A + y + AF 2 + 0 ] 2 AA A  $\mathbf{A} = \begin{bmatrix} \mathbf{A} & \mathbf{A} & \mathbf{A} & \mathbf{A} \end{bmatrix} \mathbf{A} = \begin{bmatrix} \mathbf{A} & \mathbf{A} & \mathbf{A} \end{bmatrix} \mathbf{A} = \begin{bmatrix} \mathbf{A} & \mathbf{A} & \mathbf{A} & \mathbf{A} \end{bmatrix} \mathbf{A} = \begin{bmatrix} \mathbf{A} & \mathbf{A} & \mathbf{A} & \mathbf{A} \end{bmatrix} \mathbf{A} = \begin{bmatrix} \mathbf{A} & \mathbf{A} & \mathbf{A} & \mathbf{A} \end{bmatrix} \mathbf{A} = \begin{bmatrix} \mathbf{A} & \mathbf{A} & \mathbf{A} & \mathbf{A} & \mathbf{A} \end{bmatrix} \mathbf{A} = \begin{bmatrix} \mathbf{A} & \mathbf{A} & \mathbf{A} & \mathbf{A} & \mathbf{A} & \mathbf{A} \end{bmatrix} \mathbf{A} = \begin{bmatrix} \mathbf{A} & \mathbf{A}$ مهد[ بعر مع به به م م [دير] لا [ ددير ب ه د ښه] من ب به ( به به ( به به د ) مع به م به اله ا 

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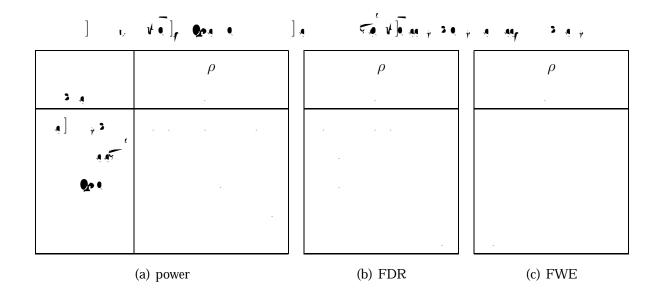


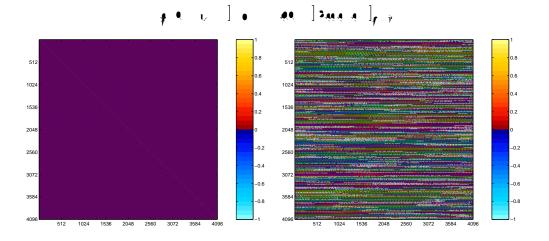
(a)  $\rho = .00$ 

(b)  $\rho = .70$ 

(c)  $\rho = .95$ 

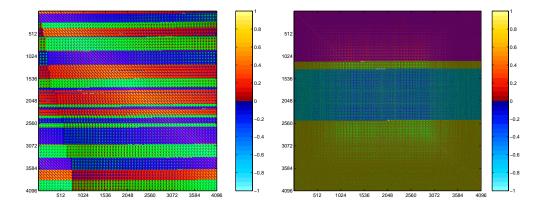
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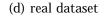


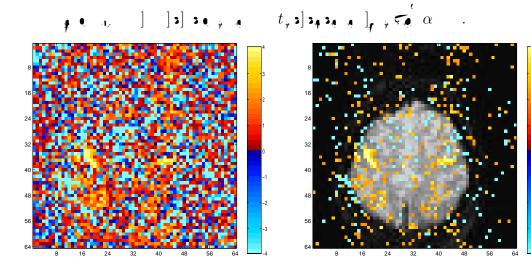






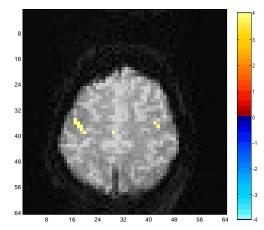




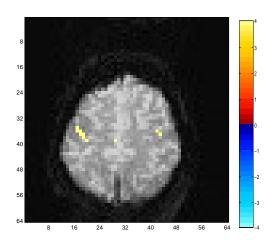


(a) Sample *t*-statistic image

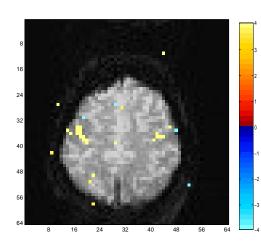




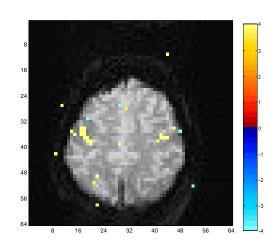
(c) FWE Bonferroni method



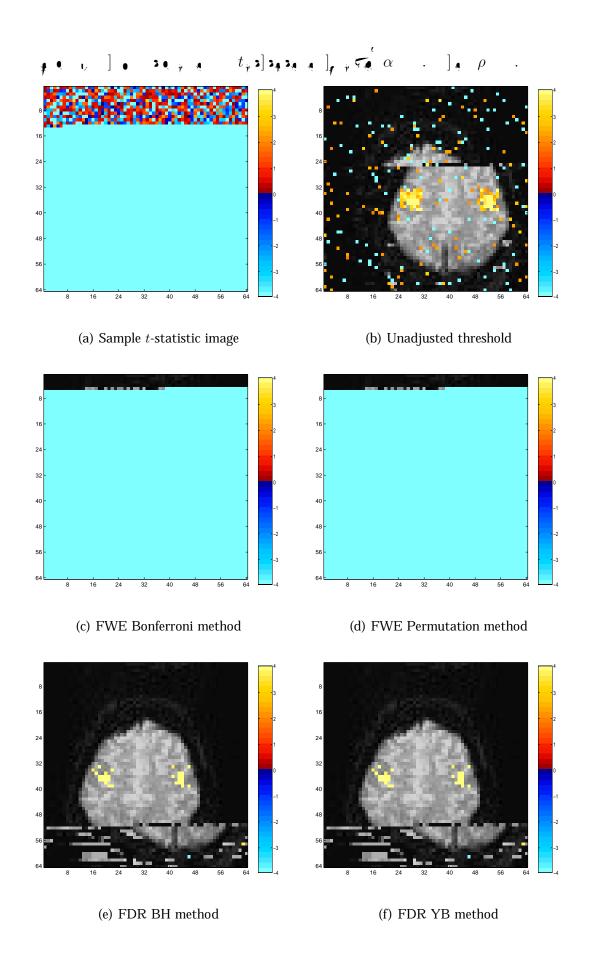
(d) FWE Permutation method

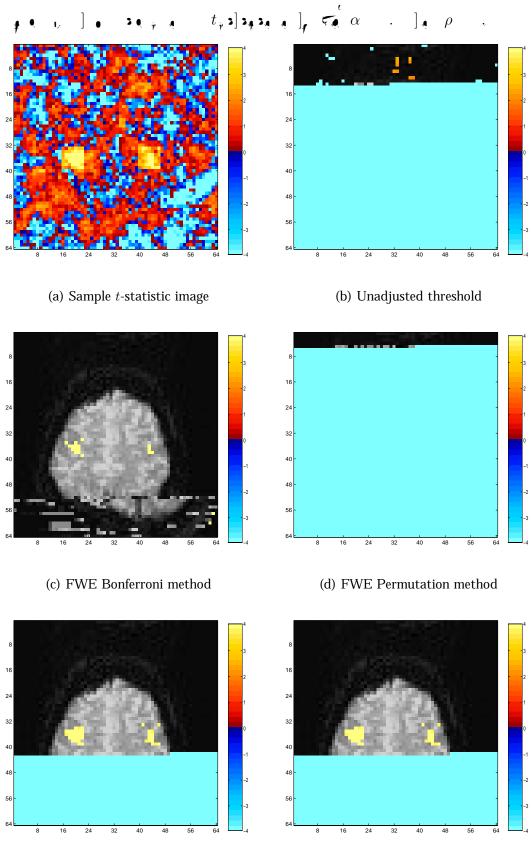


(e) FDR BH method



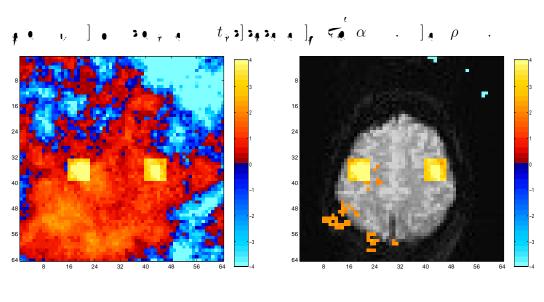
(f) FDR YB method





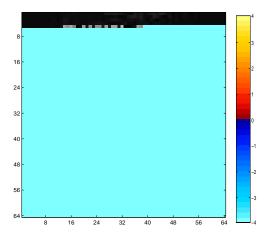
(e) FDR BH method

(f) FDR YB method

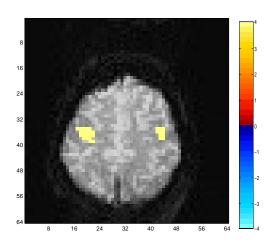


(a) Sample *t*-statistic image

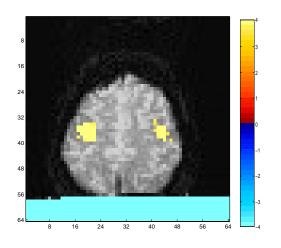




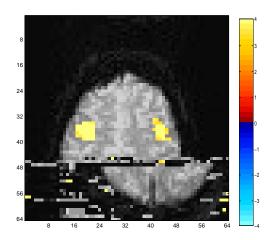
(c) FWE Bonferroni method

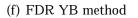


(d) FWE Permutation method



(e) FDR BH method





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