# Mechanism Design with Correlated Information 

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## Optimal mechanism design

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When bidder information is correlated

- There exists a mechanism that is efficient and leaves bidders with zero expected surplus
- Full-surplus extraction


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- Joint probability distribution $P$ over $\left(X_{1}, X_{2}\right)$
- All this is common knowledge


## Model (continued)

- From $P$ define a matrix of conditional probabilities, $P_{1}$
- $P_{1}$ is a $m \times m$ matrix with elements $\operatorname{Pr}\left(x_{2} \mid x_{1}\right), x_{1}, x_{2} \in X$
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- Assumption: $P_{1}$ and $P_{2}$ are full-rank matrices
- Assumption: Single-crossing condition is satisfied


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That is, for all $x_{1} \in \mathrm{X}$,

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It is efficient as single-crossing is satisfied
It is revenue-maximizing because buyer expected surplus is zero:
At $X_{1}=x_{1}$, for any $x_{1} \in X$, buyer 1 's expected surplus is

$$
u_{1}\left(x_{1}\right)-\sum_{x_{2} \in X} \operatorname{Pr}\left(x_{2} \mid x_{1}\right) c_{1}\left(x_{2}\right)=u_{1}\left(x_{1}\right)-u_{1}\left(x_{1}\right)=0
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Efficient allocation rule: $Q\left(X_{1}, X_{2}\right)=($ prob 1 gets it, prob 2 gets it)

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$$
\mathbf{u}_{\mathbf{i}}-P_{i} \mathbf{c}_{\mathbf{i}}=\binom{0-[(0.75)(-0.125)+(0.25)(0.375)]}{0.25-[(0.25)(-0.125)+(0.75)(0.375)]}=\binom{0}{0}
$$

## Caveats

The optimal mechanism is

- Is not detail free
- Not ex post individually rational
- Does not work with limited liability

