# Introduction to linear programming 

Lycée Jules Haag, Besançon, April 12th 2012

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How many boxes of each kind should they make in order to maximize the profit?

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This will be called the feasible region.


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Can we conjecture the statement of the general theorem?

Conjecture : The maximum of a linear objective function in a polygonal feasible region is attained at a corner point (or vertex) of the feasible region.

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Step 1 The maximum of the objective function on a segment is attained at an endpoint of the segment.

Let $p(x, y)=a x+$ by be a general linear objective function.

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We obtain
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And then, after a few computations... $p(M)=a x_{M}+b y_{M}=(1-t) p(A)+t p(B) \leq \max \{p(A), p(B)\}$.

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This yields the conclusion of Step 1.

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End of proof.

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Why should we prove it???

